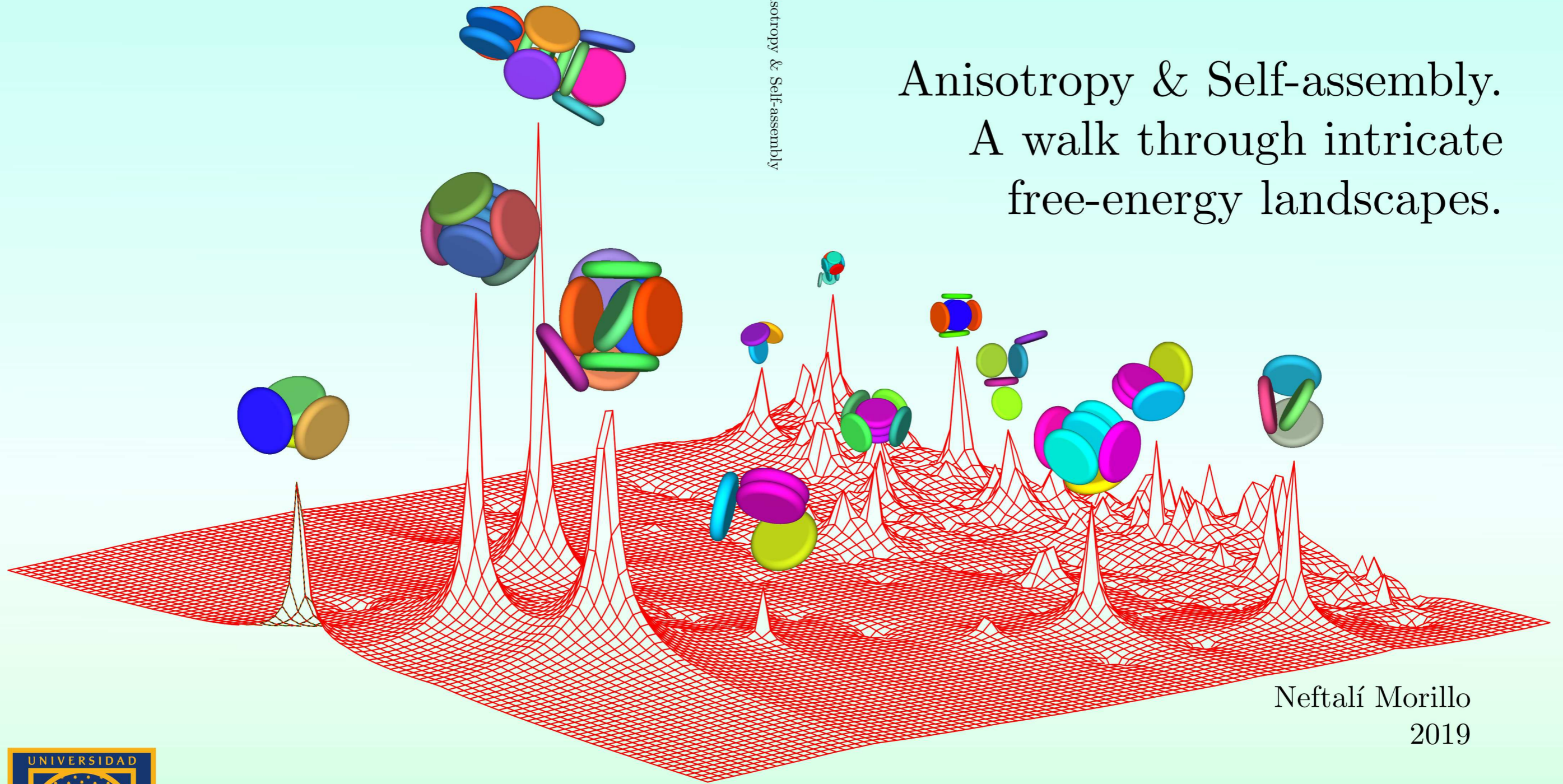


# Anisotropy & Self-assembly. A walk through intricate free-energy landscapes.

Anisotropy & Self-assembly



Neftalí Morillo  
2019

Neftalí



**Anisotropy & Self-assembly.  
A walk through intricate  
free-energy landscapes.**

PhD Thesis

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The research leading to these results was performed at the Department of Physical, Chemical and Natural System of the Pablo de Olavide University (Seville, Spain), and at the Debye Institute for NanoMaterials Science, Soft condensed matter, Utrecht University (Utrecht, the Netherlands).

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# **ANISOTROPY & SELF-ASSEMBLY. A WALK THROUGH INTRICATE FREE-ENERGY LANDSCAPES.**

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*A thesis submitted in fulfilment of the requirements  
for the degree of Doctor of Philosophy at the  
Pablo de Olavide University*

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### **CERTIFICA**

Que la presenta memoria titulada “Anisotropy & Self-assembly. A *walk through intricate free-energy landscapes*” que presenta Juan Neftalí Morillo García para la obtención del título de Doctor con Mención Internacional, ha sido realizada bajo mi dirección en este departamento dentro del programa de doctorado Medio Ambiente y Sociedad, y que cumple con los requisitos para poder optar a la Mención Internacional.

Sevilla, Mayo 2019

Fdo. Alejandro  
Cuetos Menéndez

*Sometimes science is more art than science, Morty. A lot of people don't get that.*

— Rick Sanchez, Rick And Morty (Season 1, Episode 6)



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# ABSTRACT

The selective aggregation of discotic molecules or colloids is the key factor behind the outstanding properties of many substances, of natural or synthetic origins, like clays used in cosmetics and other coatings or polycyclic aromatic hydrocarbons employed in optoelectronic devices. These are just two examples from a plethora of substances where the interplay between shape anisotropy and interaction anisotropy is at hand in the constituents provoking the emergence of interesting macroscopic features. Keeping that perspective, this thesis is written with the firm belief that a better understanding of the aggregation and self-assembly processes will render in better technological applications. In that sense, the problem to be tackled is very broad in terms of the number of variables implied, since we are investigating the reach of specific properties of individual particles into the behaviour of the substance they compose. Being the specific aim of this thesis to characterize the importance of anisotropy in shape and interactions in the self-assembly processes. To accomplish this, computer simulation of discotic particles modelled using coarse grain models were run on model systems. A reasonable strategy to perform them was to fix as many variables as possible for each study, as it was done in the first half of this thesis. Firstly a system of soft particles is used to gain some insight into the effect of shape anisotropy on the diffusion in structured fluids, comparing the diffusion of equivalent prolate and oblate particles. Then with a fixed oblate shape anisotropy, it is pointed out the decisive role played by the anisotropy in the interaction potential for the internal structure of aggregates and the location of the phase transitions. This knowledge is then applied in the second half of the thesis, where the dynamics of particles are studied with different interactions potentials during aggregation. Finally, to exploit everything learned, it is proposed and simulated a clay model.



# RESUMEN

La agregación selectiva de moléculas o coloides discóticos es el factor clave detrás de las propiedades sobresalientes de muchas sustancias, de origen natural o sintético, como las arcillas utilizadas en cosméticos y otros recubrimientos o hidrocarburos aromáticos policíclicos empleados en dispositivos optoelectrónicos. Estos son solo dos ejemplos de una gran cantidad de sustancias en las que la interacción entre la anisotropía de forma y la anisotropía de interacción van de la mano en los constituyentes provocando el surgimiento de características macroscópicas interesantes. Manteniendo esa perspectiva, esta tesis está escrita con la firme convicción de que una mejor comprensión de la agregación y los procesos de autoensamblado se traducirán en mejores aplicaciones tecnológicas. En ese sentido, el problema a ser abordado es muy amplio en términos del número de variables implícadas. Ya que estamos investigando el alcance de las propiedades específicas de las partículas individuales en el comportamiento de la sustancia que componen. Siendo el objetivo específico de esta tesis caracterizar la importancia de la anisotropía en su forma e interacciones en los procesos de autoensamblaje. Para lograr esto, la simulación por computadora de partículas discóticas modeladas usando modelos de grano grueso se ejecutó en sistemas modelo. Una estrategia razonable para realizarlas fue fijar tantas variables como fuera posible para cada estudio, como se hizo en la primera mitad de esta tesis. En primer lugar, se utiliza un sistema de partículas blandas para obtener una idea del efecto de la anisotropía de la forma en la difusión en fluidos estructurados, comparando la difusión de partículas prolatas y oblatas equivalentes. Luego, con una anisotropía de forma oblata fija, se señala el papel decisivo desempeñado por la anisotropía en el potencial de interacción para la estructura interna de los agregados y la ubicación de las transiciones de fase. Este conocimiento se aplica luego en la segunda mitad de la tesis, donde se estudia la dinámica de las partículas con diferentes potenciales de interacción durante la agregación. Finalmente, para explotar todo lo aprendido, se propone y se simula un modelo de arcilla.



## Introduction

This chapter aims to serve as a brief contextualization of the work, as well as a compendium of short descriptions of techniques and concepts which might be unfamiliar for the reader.

The topics covered in this thesis can be classified in the field that today is called soft-matter, term that since Pierre-Gilles de Gennes spoke of it [1], is used to frame systems whose individual constituents scale from  $\sim 1nm$  to  $\sim 1\mu m$  and manifest a change in their behaviour when forces in the magnitude of thermal fluctuations are applied. This scale ranges from small organic molecules to viruses, bacteria and cells. Therefore, involving many interesting phenomenons of chemistry and biology, which surround us in our daily lives. Most of the time, this involves that complex interactions help to scaffold bigger structures, a process usually referred to as self-assembly. Even without fully understanding the processes behind it initially, humans have exploited these properties throughout history, from clay constructions or simple culinary preparations, such as whipped cream, or mayonnaise, to present optoelectronic devices. This thesis is written with the very ambitious purpose of increasing fundamental knowledge of some topics of key relevance in the understanding of processes ruling many systems in soft matter, as well as provide the tools to link microscopic features to the final self-assembled structures. Thus helping to improve or discover new applications of these materials.

Substances whose constituents are in the mentioned size range experience very interesting phase transitions and coexistences. When the attributes of these materials are in the midway of crystalline solids and liquids, those are coherently named liquid crystals (LCs). Forming in many cases what is called mesophases, because they arrange spontaneously with a partial degree of orientational or po-

sitional ordering of their constituents, generally called mesogens.

Present technology has taken a bottom-up approach to fine-tune their specific macroscopic properties [2], making them decisive in the fabrication of many devices. LCs are well known to be used in displays, but with the plethora of possible compositions yet to be explored, the number of applications keeps increasing every day. Many of them are still optical, like photonic crystals [3, 4], but they can also have interesting charge transport properties [5] making them suitable for solar cells, organic light-emitting diodes, field-effect transistors, thermometers, lasers, and nanowires [6–10].

Most of these applications make use of molecular LCs, namely LCs whose mesogens are molecules. But to study LCs scientists usually resort to bigger particles named colloids (from the Greek word  $\kappa\acute{o}\lambda\lambda\alpha$ , which means glue), since Graham coined the term in 1861 [11], when he observed how some gluey substances could not diffuse through a membrane. Colloidal LCs, consist of colloidal particles in suspension and are of key relevance to understanding a number of processes at the molecular scales that are usually too fast to be studied by conventional microscopy. In other words, colloidal LCs are excellent model systems to unveil the behaviour of molecular LCs. However, we should always bear in mind that time scales will change accordingly when we compare the evolution of any magnitude e.g. relaxation times [12], having a significant impact on experiment design.

The dynamics of colloidal systems were first reported by Robert Brown In 1827, the Scottish botanist, on his study about pollen grains suspended in water and moving as persistently perturbed by random forces of uncertain nature [13]. Almost eighty years later, Einstein realized that this intriguing movement was due to the thermal energy that colloidal particles dissipate as a result of their collisions with the surrounding solvent molecules [14]. Einstein's theoretical intuitions, together with the work by Smoluchowski [15] and Langevin [16], were corroborated experimentally by Perrin in 1909 [17]. At that time the only possibility to test a model was to perform an experiment, but thanks to the development of computer technology, simulations have gained momentum. Now they play a decisive role in scientific research because they provide information often unreachable for technical reasons and allows us to avoid dangerous experiments or reduce costs. In particular, all the studies of this thesis were performed with techniques of molecular simulation, which we discuss further below, using the rest of this introductory chapter to provide brief descriptions of the tools and methods used through out this thesis.

## 1.1 Thermodynamics and Statistical Mechanics

Thermodynamics was born as an experimental discipline and retain most of its character to date. If we take a thermodynamic approach to describe a system we will be omitting any microscopic description of it to understand its macroscopic behaviour. Meanwhile, statistical mechanics will help us to fill this gap, linking microscopic features of the system to macroscopic variables easily measurable in a laboratory.

A thermodynamic state is controlled by a few variables. In the absence of an external field, for a multicomponent system the first principle of thermodynamics can be expressed like:

$$dU = TdS - pdV + \sum_i \mu_i dN_i \quad (1.1)$$

This equation shows the change in energy  $dU$  is controlled by a change in entropy  $dS$ , a change in volume  $dV$  and another one in the number of particles of each species  $dN_i$  (all the extensive variables). Just holding their associated intensive variables (temperature  $T$ , pressure  $p$  and chemical potential of each species  $\mu_i$ ). Starting from here, the conditions of maximum entropy or minimum energy can be derived as the equilibrium conditions of the system [18]. Likewise, applying the Legendre transformation we can derive the rest of the thermodynamic potentials, allowing us to present the same thermodynamic state through the most suitable variables to our purposes, yielding:

Enthalpy

$$H = U + pV \quad (1.2)$$

Helmholtz free-energy

$$F = U - TS \quad (1.3)$$

and Gibbs free energy

$$G = U + pV - TS \quad (1.4)$$

Any of the potentials can be used as a fundamental equation of the system to determine its stability conditions as a function of the system variables. Starting



from Helmholtz free-energy we can derive the entropy, pressure and chemical potentials of the system like:

$$S = - \left( \frac{\partial F}{\partial T} \right)_{V, N_i} \quad (1.5)$$

$$p = - \left( \frac{\partial F}{\partial V} \right)_{T, N_i} \quad (1.6)$$

$$\mu_i = \left( \frac{\partial F}{\partial N_i} \right)_{T, V, N_{j \neq i}} \quad (1.7)$$

Controlling these variables is equivalent to control the fundamental equation of the system, nevertheless from now on, we will refer to equation 1.6, as equation of state, as it relates pressure (an intensive variable) with the rest of independent variables of the system.

### 1.1.1 Thermodynamic stability and phase transitions

Any part of a system which shows homogeneity in all its points with an average composition and the same intensive variables can be considered as a phase [19]. For this phase to be in thermodynamic equilibrium, it needs to be maximizing the entropy or minimizing any of the thermodynamic potentials. Therefore, given the fundamental equation as  $S = S(U, V, N_i)$  this would be expressed like:

$$dS = 0 \quad (1.8)$$

$$d^2S \leq 0 \quad (1.9)$$

And given any thermodynamic potential as a function of its independent variables,  $B = B(x_i)$ , the stability condition would read:

$$dB = 0 \quad (1.10)$$

$$d^2B \geq 0 \quad (1.11)$$

This conditions of equilibrium can hold for several phases in the same system at the same time. But this phases must be at the same temperature to avoid heat transfer and at the same pressure to avoid mechanic works. In the case of multicomponent systems the chemical potential should also be the same to avoid diffusions, arriving to the conditions in the case of  $C$  components and  $f$  phases:

$$\begin{aligned} p^\alpha &= p^\beta = p^\gamma = \dots = p^f \\ T^\alpha &= T^\beta = T^\gamma = \dots = T^f \\ \mu_1^\alpha &= \mu_1^\beta = \mu_1^\gamma = \dots = \mu_1^f \\ \mu_2^\alpha &= \mu_2^\beta = \mu_2^\gamma = \dots = \mu_2^f \\ &\cdot \\ &\cdot \\ &\cdot \\ \mu_C^\alpha &= \mu_C^\beta = \mu_C^\gamma = \dots = \mu_C^f \end{aligned} \quad (1.12)$$

Providing  $C(f-1)$  equations and  $2+f(C-1)$  unknown variables, therefore the number of possible solutions reads:

$$L = 2 + f(C - 1) - C(f - 1) = 2 + C - f \quad (1.13)$$

Equation known as Gibbs Phases Rule, which gives us the number of phases that can coexist. For a monocomponent system the equilibrium of two phases arise in a line ( $L = 2 + 1 - 2 = 1$ ), known as binodal, and the equilibrium of three phases in a point ( $L = 0$ ) known as triple point [19, 20]. Not being possible the coexistence of more than three phases.

## 1.1.2 Statistical mechanics

This discipline is capable to relate the microscopic degrees of freedom of a system with its thermodynamic properties. A macroscopic system holding an Avogadro's number ( $N_A$ ) of particles with  $r$  degrees of freedom each, leave us with a number

of equations in the order of  $N_A$ , precisely describing the system, but in the end unsolvable in practice.

The physical state of a system with  $r \cdot N_A$  degrees of freedom in the context of classical physics in a given instant will be characterized by its generalize coordinates  $q_i$  and their correspondent generalized momenta  $p_i$ . The mathematical space constituted by  $\{q_i, p_i\}$  is called phase space. Thermodynamic variables like temperature or entropy do not depend on coordinates in this space explicitly, but thanks to the work of Maxwell, Gibbs and Boltzmann we are able to relate both of them.

The state of a system can be represented as a point in the phase space and as we will see, averaging over a number of them we will find the thermodynamic magnitudes we are looking for. The set of points in the phase space corresponding to a macroscopic state are named Ensemble. If our system has a fixed volume, temperature and number of particles it is called Canonic Ensemble. In it we can define the classical partition function as [21–23]:

$$Q_N(V, T) = \frac{1}{N!} \Lambda^{-3N} Z_{N,rot} Z_N(V, T) \quad (1.14)$$

where  $\Lambda = h(2\pi m \kappa_B T)^{-1/2}$  is the thermal De Broglie wave length,  $Z_{N,rot}$  the orientational partition function [23, 24] and  $Z_N(V, T)$  the configuration integral:

$$Z_N(V, T) = \int \exp[-\beta V_N(\mathbf{1}, \dots, \mathbf{N})] d\mathbf{1} \dots d\mathbf{N} \quad (1.15)$$

where  $V_N(\mathbf{1}, \dots, \mathbf{N})$  is the potential energy of the system depending on the position and orientation of every particle  $d\mathbf{i} = d\mathbf{r}_i d\Omega_i$  with  $\mathbf{r}_i$  the position vector of the  $i_{th}$  particle and  $\Omega_i$  the set of angles defining their orientation.

From the partition function we can calculate the Helmholtz free energy like:

$$F = -\kappa_B T \ln \left( \frac{\Lambda^{-3N}}{N!} Z_{N,rot} V^N \right) - \kappa_B T \ln \frac{Z_N(V, T)}{V^N} \quad (1.16)$$

Now this equation together with Eqs. 1.5 to 1.7 allows us to finally calculate the pressure, entropy and chemical potentials.

To exploit this powerful machinery we rely on the ergodicity principle, telling us that for a system to be ergodic it is necessary that its evolution in time allows it to access any point of the phase space compatible with the macroscopic system in

a finite time [25]. This could only be proven for hard spheres [22]. Nevertheless, in simulation this hypothesis is assumed unless proven the contrary.

In an ergodic system the time average over any thermodynamic magnitude is equivalent to the average over the ensemble compatible with the macroscopic state. During this time the system will describe a trajectory over the phase space responsible for the value of this magnitude  $f = f(q_i, p_i)$  then the macroscopic observable measured will be [26]:

$$f_{obs} = \lim_{t_{obs} \rightarrow \infty} \langle f(q_i, p_i) \rangle_t = \lim_{t_{obs} \rightarrow \infty} \frac{1}{t_{obs}} \int_0^{t_{obs}} f(q_i, p_i) dt \quad (1.17)$$

In an ergodic system, this limit would be the same as the average over the set of microscopic configurations

$$\lim_{t \rightarrow \infty} \langle f \rangle_t = \lim_{m \rightarrow \infty} \langle f \rangle_m \quad (1.18)$$

Where  $m$  is the number of points in the phase space compatible with the macroscopic system. This equation provides two paths for computer simulations to arrive to thermodynamic variables. On one hand simulate the time evolution of the system as the techniques of Molecular Dynamics (MD) do, and on the other hand, to reproduce compatible points of the phase space as the techniques of Monte Carlo (MC) type do.

## 1.2 Simulation methods

Between the variety of simulation techniques available from the two main different approaches. Molecular Dynamics (MD) and its variants where particles trajectories are determined by numerically solving Newton's equations of motion or Monte Carlo (MC) variants where the system explores the phase space randomly. The most suitable for our purposes among them were chosen and adjusted to meet the needs of each study. When it was needed to compute dynamic magnitudes over time, it was used a special type of MD known as Brownian Dynamics, where the degrees of freedom of the solvent are not explicitly considered to reproduce the moves of colloids in suspension. In cases where the interest relied on equilibrium states, to achieve them Monte Carlo techniques were employed for faster exploring the phase space, in each case under the necessary ensemble for the variables involved. These techniques and some other computations are described below.

## 1.2.1 Spherocylinders as a model

To reduce computation time in molecular simulation a possible choice is to simplify the model employed. This is to fixate some degrees of freedom of our system, in a way that impacts as minimum as possible the observables we are trying to compute. When we assume a level of simplification that allows us to group several atoms into an indivisible particle of our model we refer to this as a coarse grain model. Currently, many simulations use a conglomerate of beads to model different shapes of particles with interactions, in this thesis a coarse grain model [27] is used to simulate flat and elongated shapes with only one body per particle. The advantage of it is that instead of computing the interaction with every bead pertaining to every particle interaction, there is just needed to compute the minimum distance between particles. The improvement of the calculations is increased as the aspect ratio becomes more extreme.

If we decide to model a system of particles without homogeneous shape, hence not using spheres, the next most simple models have  $D_{\infty,h}$  symmetry, therefore are uniaxial objects. To obtain a spherocylinder rotating a two dimensional shape we need to use the geometric place at a distance  $\sigma/2$  from a segment of length  $L$  (See figure 1.1). Using the direction of the segment as a revolution axis we would obtain a prolate spherocylinder. However, using a revolution axis

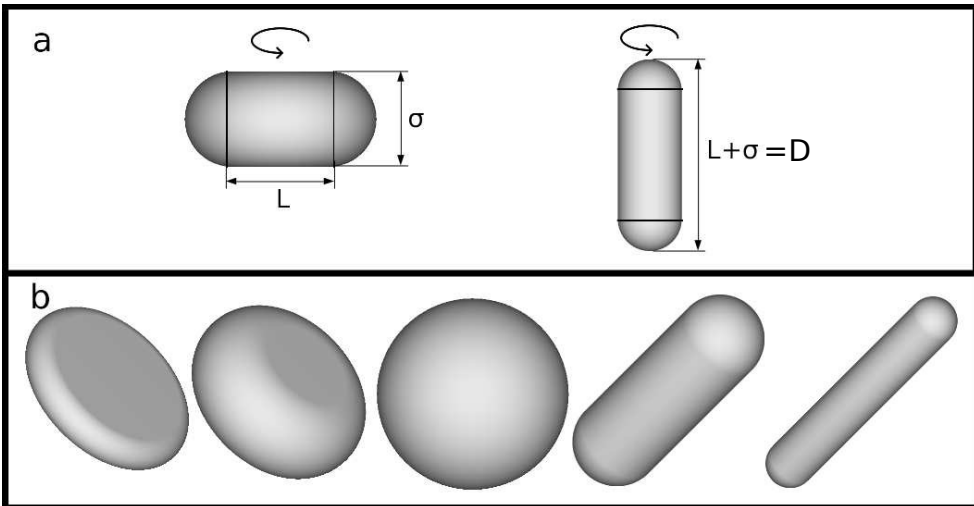


Figure 1.1: a) Schematic representation of an oblate (left) and prolate (right) solid of revolution. b) Examples of spherocylinders with anisotropies (from left to right) equal to 0.1, 0.5, 1, 5, and 10.

an imaginary coplanar line perpendicular to the segment placed in its centre we would obtain an oblate one. This shape is visually similar to the space occupied by electronic clouds or at least fits it better (especially on the edges) than the commonly employed ellipsoids that appear in the Gay-Berne potential [28].

We decided to employ spherocylinders throughout the whole thesis for the reasons exposed above, with different prolate ( $a_p > 1$ ) and oblate anisotropies ( $a_o < 1$ ) as depicted in figure 1.1, where for the same aspect ratio  $a_p = a_o^{-1}$ , when defined as follows:

$$a_p = (L + \sigma)/\sigma \quad ; \quad a_o = \sigma/(L + \sigma) \quad (1.19)$$

Efficient algorithms are able to provide the minimum distance between two segments [29] or two disks [30], for the cases of prolate and oblate spherocylinders respectively, necessary to compute the potential energy for the different interaction models. These shapes allow expressing the packing fraction as  $\eta = \rho^* V_{sc}$  where,  $V_{sc}$  is the volume of the spherocylinder, and  $\rho^* = N/(L + \sigma)^3$ , being  $N$  the number of particles.

## 1.2.2 Monte Carlo methods

The Monte Carlo methods make use of a random number generator to produce system configurations compatible with its evolution following a Markov chain. Trough this method our system will not follow a real route in the phase space, exploring it more efficiently, to later average the properties of interest from the explored configurations. This implies, in fact, an easier implementation than molecular dynamics, also allowing the use of hard potentials inaccessible to MD. But it is neither suitable to study systems out of equilibrium (it would not satisfy equation 1.18), nor to calculate transport properties or other dynamical properties. Unless very novel techniques are applied in its implementation [31–33].

In essence, the MC method is based on the calculation of averages of thermodynamical properties over a set of points of the phase space, in the canonical ensemble, this can be written as:

$$\langle f \rangle_m = \frac{\int f(\mathbf{1}, \dots, \mathbf{N}) \exp[-\beta V_N(\mathbf{1}, \dots, \mathbf{N})] d\mathbf{1} \dots d\mathbf{N}}{\int \exp[-\beta V_N(\mathbf{1}, \dots, \mathbf{N})] d\mathbf{1} \dots d\mathbf{N}} \quad (1.20)$$

Where the denominator is the configurational partition function  $Z_N$  (eq 1.15). We could randomly generate a big number of configurations, however finite, and

substitute the integrals by sums [34]:

$$\langle f \rangle_m \simeq \frac{\sum_m f(m) \exp[-\beta V_N(m)]}{\sum_m \exp[-\beta V_N(m)]} \quad (1.21)$$

Where  $m$  goes from 1 to the total number of configurations  $N_c$ . This calculation would generate a very small Boltzmann factor, meaning that even when possible, these configurations would be rather improbable and with little influence in the averages.

To perform this calculation efficiently the Monte Carlo method usually recurs to the Markov chain proposed by Metropolis *et al.* [35]. Assuming the probability to find the system in a point of the phase space with coordinates  $(\mathbf{1}, \mathbf{2}, \dots, \mathbf{N})$ , in the canonical ensemble is given by the Boltzmann factor and the configurational partition function as:

$$P(\mathbf{1}, \mathbf{2}, \dots, \mathbf{N}) = \frac{\exp[-\beta V_N(\mathbf{1}, \mathbf{2}, \dots, \mathbf{N})]}{Z_N} \quad (1.22)$$

If we generate random points of the phase space following this probability distribution function, the average of points generated in a differential volume centred in  $(\mathbf{1}, \mathbf{2}, \dots, \mathbf{N})$ , this is  $n_i = P(\mathbf{1}, \mathbf{2}, \dots, \mathbf{N}) \cdot N_c$  where  $N_c$  is the total number of generated points [36]. Now equation 1.21 derives into:

$$\langle f \rangle_m \simeq \frac{1}{N_c} \sum_{m=1}^{N_c} f(m) P(m) \quad (1.23)$$

This method employs a Markov chain to be able to follow the probability distribution. Starting from an initial configuration, we build some other close to it in the phase space evaluating the probability to transition from one to the other, defined in such a way that this probability distribution converges to the canonical probability distribution (equation 1.22). To achieve this, it is necessary to fulfil the microscopic reversibility condition, which can be expressed mathematically like [36]:

$$P(i)\Pi_{i \rightarrow j} = P(j)\Pi_{j \rightarrow i} \quad (1.24)$$

Where  $\Pi_{i \rightarrow j}$  is the probability to transition from  $i$  to  $j$  and  $P(i)$  is the probability to find the system in point  $i$ . This equation can be satisfied in many forms of the probability matrix  $\Pi_{i \rightarrow j}$ . The choice of Metropolis was:

$$\Pi_{i \rightarrow j} = \frac{P(j)}{P(i)} = \exp[-\beta(V_N(j) - V_N(i))] \quad \text{if } P(j) \leq P(i)$$

$$\Pi_{i \rightarrow j} = 1 \quad \text{if } P(j) \geq P(i)$$

To make the system follow this Markov chain we pick a random particle from an initial configuration ( $i$ ) and displace it moving the system into configuration ( $j$ ). Then we evaluate  $\Pi_{i \rightarrow j} = \exp(-\beta\Delta V_N)$  which is compared with a random number in the interval  $[0, 1]$ . When this number is less than  $\Pi_{i \rightarrow j}$  the configuration change is accepted and rejected in other cases. This process is then repeated from wherever configuration the system is now on. In this way, the system explores regions of the phase space which are compatible with the macroscopic state.

The implementation of this method extended from the NVT ensemble to the Isotension-Isothermal ensemble is presented in section 1.2.3.

### 1.2.3 Isotension-Isothermal ensemble

To be able to equilibrate states of solid phases it is mandatory that our simulation box adapts to the system to be sure that our equilibrium structure is not produced by applied stress. Or we might want to investigate the effect of some specific stress on the structure. The first to put this into practice were Parrinello and Rahman [37, 38], and apparently, after their work, several authors independently developed similar Monte Carlo techniques to implement the Isotension-Isothermal ensemble. With the first publication usually attributed to Najafabadi [39]. In the latter approach, it is only needed a transformation of the space of coordinates that allows changing the shape of the simulation box, using an adequate acceptance rule for the volume moves [36]. The transformation can be operated as follows:

$$\mathbf{r}_i = H\mathbf{s}_i \tag{1.25}$$

where  $H$  is a  $3 \times 3$  matrix whose columns are the three vectors that define the edges of the simulation box,  $\mathbf{r}_i$  are the coordinates in the real space and  $\mathbf{s}_i$  are the coordinates in a cube of  $1 \times 1 \times 1$ . Therefore, the real volume of the system is



the determinant of this matrix ( $V = \det H$ ) and can be readily introduced in the acceptance rule, this observable has to be  $\det H > 0$ , otherwise we might fall into the absurd of a negative volume or into irreversible transformations ( $\det H = 0$ ). During each volume move, a random element of the matrix  $H$  is modified to efficiently explore the phase space of the system. To compute the acceptance probability we use the function  $W$  defined as follows [40]:

$$W = \Delta U + P\Delta V - N\kappa_B T \Delta(\log V) \quad (1.26)$$

where  $U$  is the energy from the sum of the pair potentials,  $V$  the volume,  $N$  the number of particles,  $\kappa_B$  the Boltzmann constant and  $T$  the temperature. Then the volume move is accepted with probability  $P$ :

$$P = \begin{cases} 1 & \text{if } W \leq 0 \end{cases}$$

$$P = \exp(-W/\kappa_B T) \quad \text{if } W > 0$$

and rejected with probability  $(1 - P)$ . In order to implement these transformations into a simulation code, we need to understand how every part of the code is related to the relative positions of the particles to avoid artefacts in our results especially when working with anisotropic particles. Any algorithm relying on the adjacency of particles, like the ones dealing with periodic boundary conditions or cell lists should use  $s_i$  to address particles meanwhile any other relying on real distances, like the computation of the minimum distance between particles should use  $r_i$ . In this implementation, the orientations of anisotropic particles are not affected by the deformation of the simulation box and will behave well controlled by the acceptance rule as usual.

The classical Isobaric-Isothermal ensemble (NPT) implementation does not care about the shape of the simulation box and can be understood as a simplification of the isotension-isothermal ensemble, where only the diagonal elements of  $H$  matrix are varied. In it, if we start the simulations in an orthogonal box we will keep its shape, and the elements  $H_{11}$ ,  $H_{22}$  and  $H_{33}$  will be representing the sides of the box. Therefore, this shape transformation won't be needed any more and it would be enough to rescale the coordinates (for more details on this see reference [36]).

## 1.2.4 Brownian Dynamics of anisotropic particles

Brownian Dynamics (BD) simulation technique is employed to mimic the behaviour of suspensions of colloidal particles, whose size is significantly larger

than that of the solvent molecules. Hence, the presence of the solvent is effectively incorporated by imposing a random drifting of the particles, whose trajectories are obtained by integrating the Langevin equation [26], instead of numerically solving Newton's equations of motion as it is usually done in Molecular Dynamic techniques. In BD simulations of non-spherical particles, the position,  $\mathbf{r}_j$ , and orientation,  $\hat{\mathbf{u}}_j$ , of a particle  $j$  over time  $t$  are calculated by the following set of equations [41]:

$$\begin{aligned} \mathbf{r}_j^{\parallel}(t + \Delta t) = & \mathbf{r}_j^{\parallel}(t) + \frac{D_{s,\parallel}}{\kappa_B T} \mathbf{F}_j^{\parallel}(t) \Delta t + \\ & + (2D_{s,\parallel} \Delta t)^{1/2} R^{\parallel} \hat{\mathbf{u}}(t) \end{aligned} \quad (1.27)$$

$$\begin{aligned} \mathbf{r}_j^{\perp}(t + \Delta t) = & \mathbf{r}_j^{\perp}(t) + \frac{D_{s,\perp}}{\kappa_B T} \mathbf{F}_j^{\perp}(t) \Delta t + \\ & + (2D_{s,\perp} \Delta t)^{1/2} (R_1^{\perp} \hat{\mathbf{v}}_{j,1}(t) + R_2^{\perp} \hat{\mathbf{v}}_{j,2}(t)) \end{aligned} \quad (1.28)$$

$$\begin{aligned} \hat{\mathbf{u}}_j(t + \Delta t) = & \hat{\mathbf{u}}_j(t) + \frac{D_{s,\vartheta}}{\kappa_B T} \mathbf{T}(t) \times \hat{\mathbf{u}}(t) \Delta t + \\ & + (2D_{s,\vartheta} \Delta t)^{1/2} (R_1^{\vartheta} \hat{\mathbf{v}}_{j,1}(t) + R_2^{\vartheta} \hat{\mathbf{v}}_{j,2}(t)) \end{aligned} \quad (1.29)$$

where  $\mathbf{r}_j^{\parallel}$  and  $\mathbf{r}_j^{\perp}$  are the projections of the position vector  $\mathbf{r}_j$  on the direction parallel and perpendicular to  $\hat{\mathbf{u}}_j$ , respectively;  $\mathbf{T}_j$  is the total torque acting over particle  $j$  [42];  $\mathbf{F}_j^{\parallel}$  and  $\mathbf{F}_j^{\perp}$  are the components of the force parallel and perpendicular, respectively, to  $\hat{\mathbf{u}}_j$ ;  $R^{\parallel}$ ,  $R_1^{\perp}$ ,  $R_2^{\perp}$ ,  $R_1^{\vartheta}$  and  $R_2^{\vartheta}$  are independent Gaussian random numbers of variance 1 and zero mean;  $\hat{\mathbf{v}}_{j,1}$  and  $\hat{\mathbf{v}}_{j,2}$  are two random perpendicular unit vectors, being also perpendicular to vector  $\hat{\mathbf{u}}_j$ . The short time diffusion coefficients in the direction parallel and perpendicular to the molecular axis, and rotational diffusion coefficient,  $D_{s,\parallel}$ ,  $D_{s,\perp}$  and  $D_{s,\vartheta}$ , have been calculated for both prolate and oblate particles with the analytical expressions proposed by Shimizu for spheroids [43]:

$$\begin{aligned} D_{s,\perp} = & D_0 \frac{(2a^2 - 3b^2)S + 2a}{16\pi(a^2 - b^2)} b, \\ D_{s,\parallel} = & D_0 \frac{(2a^2 - b^2)S - 2a}{8\pi(a^2 - b^2)} b, \\ D_{s,\vartheta} = & 3D_0 \frac{(2a^2 - b^2)S - 2a}{16\pi(a^4 - b^4)} b, \end{aligned} \quad (1.30)$$

In the above equations,  $D_0 = \kappa_B T / \mu_s \sigma$ , where  $k_B$  is the Boltzmann constant,  $T$  the absolute temperature, and  $\mu_s$  the viscosity of the medium.  $S$  is a geometric parameter that for prolate particles reads [43]

$$\text{with } S = \frac{2}{(a^2 - b^2)^{1/2}} \log \frac{a + (a^2 - b^2)^{1/2}}{b}, \quad (1.31)$$

$$(a = (L + \sigma)/2, b = \sigma/2)$$

and for oblate particles reads

$$\text{with } S = \frac{2}{(b^2 - a^2)^{1/2}} \arctan \frac{(b^2 - a^2)^{1/2}}{a}, \quad (1.32)$$

$$(a = \sigma/2, b = L/2)$$

## 1.2.5 Cluster move

Simulations in the NPT ensemble can suffer from long equilibration times during compressions due to particle overlaps [44]. To overcome this and inspired by the work of Ashton and collaborators [45], their cluster move algorithm (see pseudocode in alg. 1) has been implemented to explore low density regions of the phase diagrams presented in this thesis.

There are systems where aggregates can not compress internally, therefore during a volume move the simulation box can not shrink unless every cluster moves as a whole. But instead of rescaling coordinates, in this move a point reflection about a random pivot point is performed, to better sample the phase space. In order to easily obey detailed balance, any move producing a change in energy is considered an overlap obtaining a rejection free move. Even so, every system investigated at densities below 1 particle per unit volume (given a length unit equal to the biggest dimension of the particles involved) experienced a faster equilibration. At higher densities, this algorithm becomes useless when overlaps drive it to mirror the configuration of every particle of the system, what is pointless under periodic boundary conditions.

**Algorithm 1:** Pivot point cluster move

---

```

1: Select random particle  $p_i$  and pivot point
2: Label  $p_i$  and its cluster as "To move"
3: while "To move" stack is not empty do
4:   Remove first particle  $p_i$  from the "To move" stack
5:   Label it as "Moved" and point reflect it
6:   if  $p_i$  overlaps with UNLABELED particles then
7:     Label those overlapped particles and their clusters as "To move"
8:   end if
9: end while

```

---

### 1.3 Distribution Functions and order parameters

The relative position and orientation of the constituents of a substance are key parameters to characterize its state. In this thesis, all studies are performed over monocomponent systems, this denies us the possibility to define these magnitudes from the relative positions and orientations of the particles of different components, what would be very useful given the case. Although thermodynamic variables such as density, entropy or enthalpy undergo abrupt changes in phase transitions, the internal order is characteristic of each mesophase. Therefore, the ability to quantify it makes of order parameters and distribution functions indispensable tools in this field.

Since we are dealing with anisotropic particles and forcefields, it will be useful to track structural properties. We start by defining the Nematic Order Parameter  $S_2$  as:

$$S_2 = \left\langle \frac{1}{N} \sum_1^N P_2(\hat{\mathbf{u}}_i \cdot \hat{\mathbf{n}}) \right\rangle \quad (1.33)$$

Where  $P_2$  is the second order Legendre polynomial,  $N$  the number of particles,  $\langle \dots \rangle$  denotes the statistical average over configurations and  $\hat{\mathbf{u}}_i$  and  $\hat{\mathbf{n}}$  are the unitary vectors of the orientations of the particles and the nematic director respectively. The nematic director is usually dominated by an external field but can also arise from an orientational symmetry break during a phase transition. In those cases the vector is unknown beforehand and it is usually calculated from

the Order Parameter Tensor  $\mathbf{Q}$  :

$$Q_{\alpha\beta} = \frac{1}{2N} \left\langle \sum_1^N (3\hat{\mathbf{u}}_{i\alpha} \cdot \hat{\mathbf{u}}_{i\beta} - \delta_{\alpha\beta}) \right\rangle \quad (1.34)$$

Where  $\delta_{\alpha\beta}$  is the Kronecker delta and  $\alpha$  and  $\beta$  indicate the vector components. This tensor can be diagonalized being  $S_2$  its biggest eigenvalue and  $\hat{\mathbf{n}}$  the correspondent eigenvector.  $S_2$  Can vary from values close to 0 in an isotropic situation to values close to 1 when all particles are almost parallelly oriented.

However, to investigate structural properties, the distribution functions are a more powerful tool, since with it we also obtain detailed information about the orientational order or any other parameter which can be computed as a function of the distance between particles. We will use a set of them starting from the radial distribution function  $g(r)$ , which can give us the average amount of particles between  $r$  and  $r + dr$  as,  $4\pi r^2 \rho g(r) dr$ . To define other distributions of interest we have to particularize it depending on the region of the space where we are interested to know the probability of finding a particle. A common feature of these functions is its asymptotic tendency to one at long distances (in the thermodynamic limit). To our purpose we can summarize the distributions of interest with the formula:

$$g_{\zeta}(r_{\zeta}) = \frac{N_H(\zeta)}{\rho N N_c V(\zeta)} \quad (1.35)$$

This function when multiplied by the density, remains to be the average over particles and configurations found in the volume  $V(\zeta)$  surrounding position  $r_{\zeta}$ , from a particle located at the coordinates' origin. Where  $N_H$  is the total number of particles inside the volume  $V(\zeta)$ ,  $N$  the total number of particles and  $N_c$  the number of sampled configurations and  $\rho$  the density of the system. In table 1.1 are indicated the definitions of  $V(\zeta)$  and  $r_{\zeta}$  correspondent to each particular example of distribution function used in this thesis, being each row a specific choice on how to implement equation 1.35, among many possibilities.

Each one of these functions can be used to measure a different level of partial order or the system structure. The radial distribution functions can easily tell us if we are leaving the isotropic phase starting to display any sort of peaks when we find them at small values of  $r/\sigma$  it is a sign some level of order in the first neighbours. In the cases where we are studying a system with layers the maximums of the parallel distribution function  $g_{\parallel}(r_{\parallel})$  mark their location. If we are interested in

	$r_\zeta$	$V(\zeta)$
$g(r)$	$r =  \mathbf{r} $	$\frac{4\pi}{3} ((r + \Delta r/2)^3 - (r - \Delta r/2)^3)$
$g_{\parallel}(r_{\parallel})$	$r_{\parallel} = \mathbf{r} \cdot \mathbf{n}$	$\pi (R^2 \Delta r_{\parallel} - 1/3((r_{\parallel} + \Delta r_{\parallel}/2)^3 - (r_{\parallel} - \Delta r_{\parallel}/2)^3))$
$g_{\perp}(r_{\perp})$	$r_{\perp} =  \mathbf{r} - (\mathbf{r} \cdot \mathbf{n})\mathbf{n} $	$4\pi/3 \left( (R^2 - (r_{\perp} + \Delta r_{\perp})^2)^{\frac{3}{2}} - (R^2 - r_{\perp}^2)^{\frac{3}{2}} \right)$
$g_{\perp}^0(r_{\perp}^0)$	$r_{\perp} =  \mathbf{r} - (\mathbf{r} \cdot \mathbf{n})\mathbf{n} $ being $ \mathbf{r} \cdot \mathbf{n}  < L$	$\pi((r_{\perp} + \Delta r_{\perp})^2 - r_{\perp}^3)L$

Table 1.1: Terms employed to calculate each distribution function. Where  $R$  is half the length of the simulation box and  $L$  is the thickness of the layer.  $\Delta r_\zeta$  is the width of the volume element  $V_\zeta$  surrounding position  $r_\zeta$ .

the average order of the layers we can use the perpendicular distribution function  $g_{\perp}(r_{\perp})$ , but if we want to focus on the inner order of the layer where the origin of coordinates is located, we should use the ground perpendicular distribution function  $g_{\perp}^0(r_{\perp}^0)$

For our purpose is useful to define one more distribution function  $g_2(r)$ , which averages the value of the second Legendre polynomial obtained for particles at each distance, formulated as follows:

$$g_2(r) = \langle P_2(\mathbf{u}_i \cdot \mathbf{u}_j) \rangle \quad (1.36)$$

This coincides with the spherical harmonic  $Y_{20}$ , frequently employed for the study of polyatomic fluids.

## 1.4 Dynamic observables

### 1.4.1 Mean Squared Displacement

The Mean Squared Displacement (MSD) computes, as its name indicates the displacement of particles from an initial position over time. Therefore, quantifies particle diffusions at different times and is calculated as follows:

$$\langle \Delta r^2(t) \rangle = \left\langle \frac{1}{N} \sum_{j=1}^N (\mathbf{r}_j(t) - \mathbf{r}_j(0))^2 \right\rangle, \quad (1.37)$$

where the brackets  $\langle \dots \rangle$  denote ensemble average. We have also computed the MSD parallel,  $\langle \Delta r_{\parallel}^2(t) \rangle$ , and perpendicular,  $\langle \Delta r_{\perp}^2(t) \rangle$ , to the nematic director  $\hat{\mathbf{n}}$ . This vector has been calculated diagonalizing a symmetric traceless tensor incorporating the orientation vectors of all the particles [46]. The MSDs at long time scales are used to estimate the long time diffusion coefficients as follows for the perpendicular, parallel and total respectively:

$$\begin{aligned} D_{l,\perp} &= \lim_{t \rightarrow \infty} \frac{\langle \Delta r_{\perp}^2(t) \rangle}{4t}, \\ D_{l,\parallel} &= \lim_{t \rightarrow \infty} \frac{\langle \Delta r_{\parallel}^2(t) \rangle}{2t}, \\ D_l &= \lim_{t \rightarrow \infty} \frac{\langle \Delta r^2(t) \rangle}{6t}, \end{aligned} \quad (1.38)$$

We stress that these diffusion coefficients are different from those calculated in Eq. 1.30, which only take into account the effect of the solvent, but disregard the interaction with other colloidal particles.

We have also estimated the rotational diffusivity in the isotropic and nematic phases. To this end, we have calculated the orientational time-correlation functions [34]

$$C_1(t) = \langle P_1[u_i(t) \cdot u_i(0)] \rangle \quad (1.39)$$

The typical decay time,  $\tau_1$ , of this function could be estimated as

$$\tau_1 = \int_0^{\infty} C_1(t) dt \quad (1.40)$$

From this decay time, it is possible to define a rotational diffusion coefficient as  $D_{rot} = 1/2\tau_1$  [34].

## 1.4.2 Self-intermediate scattering function

The Self-intermediate scattering function (s-ISF) gives a measure of the structural relaxation decay of density fluctuations and reads:

$$F_s(\mathbf{q}, t) = \frac{1}{N} \left\langle \sum_{j=1}^N \exp[i\mathbf{q} \cdot (\mathbf{r}_j(t+t_0) - \mathbf{r}_j(t_0))] \right\rangle, \quad (1.41)$$

where  $\mathbf{q}$  is the wave vector calculated at relevant peaks of the static structure factor and  $\mathbf{r}_j(t)$  is the particle position at time  $t$ .

### 1.4.3 Four-point susceptibility function

This function determines the eventual occurrence of collective motion by mapping the dynamics in two different spatial domains at two different times, hence its four-point nature. To explore the occurrence of collective motion, we can compute the four-point susceptibility function,  $\chi_4(q, t)$ , which in fact measures the fluctuations of the s-ISF and provides information on the size and time evolution of the transient clusters formed in the fluid [47–49]. It is calculated as:

$$\chi_4(q, t) = N[\langle f_s^2(\mathbf{q}, t) \rangle - F_s^2(\mathbf{q}, t)] \quad (1.42)$$

where  $f_s(\mathbf{q}, t) = 1/N \sum_{j=1}^N \cos(\mathbf{q}[\mathbf{r}_j(t+t_0) - \mathbf{r}_j(t_0)])$  is the real part of the instantaneous value of the s-ISF.





## Dynamics of particles with *opposite* geometries

The thermodynamics of anisotropic particles have been extensively studied in the past. Phase diagrams and equilibrium structures obtained in systems of prolate [50,51] and oblate [52,53] purely repulsive particles have been well characterized and also a number of potentials, such as the Gay-Berne [28], Kihara [54] or the more recent Gay-Berne-Kihara potential [27, 55] have been investigated. In this chapter, a specific framework is set to compare, in a meaningful way, oblate and prolate geometries in the context of ordered fluids.

As described in section 1, this thesis is focused on systems with a significant degree of orientational and/or positional order, like liquid crystals (LCs). In this kind of systems, structural properties are the key to the plethora of applications and molecular simulation has been crucial to understand and characterize liquid crystalline materials [56, 57], but not so many studies have been dedicated to the study of their dynamical properties, especially for oblate particles.

Dynamical properties are equally important and contribute to determining the performance of a material. Laschat *et al.* showed that discotic mesogens are not useful as switching units in LC displays due to the fact that their LCs typically have larger viscosity than that measured in LCs of rod-like mesogens [58]. This gives us a hint on the impact of particle anisotropy on the transport properties and on the consequent design of devices for the above-mentioned applications.

If we keep up the comparison of particles with opposite geometries we could vary the aspect ratios of each to obtain the same values in terms of anisotropy, volume, or diffusion coefficients. The scope of the work in this chapter is to compare the relative ability of prolate and oblate particles of diffusing in their nematic phases, where particles are free to flow as in a liquid with their centre of mass po-

sitions randomly distributed, but maintaining long-range directional order. To this end, we impose the same values of the infinite-dilution translational or rotational diffusion coefficients for both prolate and oblate particles (See equation 1.30). This choice represents an important change with respect to past studies that assumed the same particle volume or aspect ratio [59, 60].

Very early theoretical studies predicted an anisotropy in the diffusion of the particles in nematic fluids [59, 60], later corroborated by simulations [61, 62]. Specifically, it was concluded that in the nematic phase of prolate particles the diffusion is faster in the direction parallel to the nematic director. In particular, the long-time diffusion coefficient parallel to the nematic director,  $D_{\parallel}$ , is larger than the diffusion coefficient perpendicular to the nematic director,  $D_{\perp}$ . The opposite tendency is observed in nematic phases of oblate particles. Nevertheless, in positionally order smectic and columnar LCs, the layer-to-layer and column-to-column diffusion results to be significantly reduced and becomes slower than the in-layer or in-column diffusion [63–68].

For this system, we expect that the particle mean-square displacement (MSD) to be a linear function of the time  $t$ , whereas the particle displacements are Gaussian distributed. The linear behaviour of the MSD with time is generally referred to as Fickian diffusion, after Adolf Fick, who derived the laws of diffusion in 1855 [69]. To perform this study we used Brownian Dynamics (BD) simulations (See section 1.2.4), with them we study the dynamics of nematic colloidal LCs of disk-like and rod-like particles and show that a typical Fickian diffusion is observed at short and long time scales, meanwhile at intermediate time scales, when particles start to collide with each other, this appears to be yet Fickian but not Gaussian (FNG). This feature is very attractive to investigate in nematic LCs where at different time scales, this can be addressed over two independent directions at distinctive particles anisotropies, what will occupy the first part of this study. In Nematic systems, it is observed that they can induce non-Fickian subdiffusion or superdiffusion of host particles, generally referred to as anomalous diffusion [70]. In addition, the relatively moderate packing fractions of nematics, as compared to smectic or columnar LC phases, allow to more easily achieve the asymptotic limit of long time scales and distinguish it from the non-Gaussian signature of the caging effect at shorter times. Previous works observed non-Gaussian dynamics in smectic [64, 66, 68] and columnar [67, 71] LCs, where the diffusion perpendicular, respectively, to the layers and columns, is especially slow and determining the onset of the long time diffusive regime not always straightforward.

The non-Gaussian diffusion observed in heterogeneous systems has been in-

investigated by stochastic models assuming random diffusivities, such as the generalised grey Brownian motion [72, 73] and the diffusing diffusivities model [73–75]. The observation of FNG diffusion in very dilute colloidal suspensions of hard-sphere PMMA particles, which would be expected to follow a canonical Brownian dynamics, has been interpreted as a convincing argument supporting its ubiquitous nature [76]. However, the FNG signature in especially complex systems, such as colloidal liquid crystals (LCs), where an anisotropic diffusion is observed, is still to be explored.

To close this study, three case scenarios are defined, to complete the comparison of this *opposite* geometries observing the differences and similarities of the diffusion in equivalent fluids of prolate and oblate spherocylinders. The cases of particles with (i) equal aspect ratio, (ii) equal infinite-dilution translational diffusion coefficients, and (iii) equal infinite-dilution rotational diffusion coefficients. This infinite-dilution diffusion coefficients, defined in section 1.4.1, are the same as those calculated in concentrated suspensions at very short time scales, when the particles are still rattling around their original position and have not yet interacted with their nearest neighbors.

## 2.1 Model and methodology

For this study as well as for the whole thesis we have used spherocylindrical particles as described in section 1.2.1 with the desired anisotropies. Since we are comparing the relative ability of oblate and prolate spherocylinders to diffuse in a nematic LC phase, one obvious choice would be to impose the same particle aspect ratio for the two geometries. Nevertheless, this choice, which allows one to consistently assess the phase behaviour of particles of different anisotropies, would not reproduce the same conditions of mobility at very short timescales or in extremely dilute suspensions. However, since the aim of the second part of this chapter is to have an insight into the effect of anisotropy on the long-time diffusion in structured fluids, we also equate the isotropic infinite-dilution translational,  $D^s = (2D_{\perp}^s + D_{\parallel}^s)/3$ , or rotational,  $D_{\vartheta}^s$ , diffusion coefficients of oblate and prolate particles. To make this comparison we have chosen the anisotropies  $a_p = 27$  and  $a_o = 0.1$  for the case of translational equivalence, and  $a_p = 15.6$  and  $a_o = 0.1$  for the case of rotational equivalence. To fully clarify the effect of this choice, we have benchmarked our result with the case of identical shape anisotropy, where  $a_p = 1/a_o = 15.6$  employed in the first part of the study.

To describe the inter-particle interactions, we have used the Soft Repulsive

Spherocylinder (SRS) potential, which is obtained by truncating and shifting the Kihara potential [54] and was used in the past to model prolate [77–79], and oblate mesogens [55]. The SRS potential reads

$$U_{SRS} = \begin{cases} 4\varepsilon \left[ \left( \frac{\sigma}{d_m} \right)^{12} - \left( \frac{\sigma}{d_m} \right)^6 + \frac{1}{4} \right] & \frac{\sigma}{d_m} \leq \sqrt[6]{2} \\ 0 & \frac{\sigma}{d_m} > \sqrt[6]{2} \end{cases} \quad (2.1)$$

In the above equation,  $\varepsilon$  is the unit of energy, while  $d_m$  is the minimum distance between the central cores of the particles, being a segment of length  $L$  for prolate particles, and a disk of diameter  $L$  for oblate particles. Efficient algorithms to calculate the minimum distance have been published for both particle geometries [30, 42]. As mentioned before,  $\sigma$  represents the diameter of prolate particles as well as the thickness of oblate particles.

To simulate the Brownian motion of the particles, we have carried out Brownian Dynamics (BD) simulations as described in section 1.2.4. Using cubic boxes, for each of the mentioned scenarios (*i*, *ii* and *iii*), we have started from an initial configuration of  $N$  perfectly parallel particles randomly distributed in a cubic box, with  $N = 1260 - 2232$  at the desired packing fraction  $\eta = \rho v_m$ , being  $\rho$  the numeric density of particles and  $v_m$  the volume of the particles [80]. To equilibrate the system, we have run BD simulations of about  $t = 2000\tau$  for prolate and  $t = 20000\tau$  for oblate particles, where  $\tau = \sigma^3 \mu_s / k_B T$  is the time unit and  $\sigma$  is our system's length unit is. The time step was fixed to  $\Delta t = 10^{-3}\tau$  for prolate and  $10^{-5}\tau$  for oblate particles, while the temperature is  $T^* = k_B T / \varepsilon = 1.465$  for both geometries. At this temperature, the phase behaviour of soft spherocylinders resembles that of a fluid of hard spherocylinders [77, 78]. The equilibration of the system has been monitored by checking the evolution of total energy and nematic order parameters. After equilibration, an additional BD simulation was carried out to compute a number of dynamical observables described in chapter 1: (*i*) the mean square displacement (MSD), (*ii*) the self part of the intermediate scattering function (s-ISF), and (*iii*) the four point susceptibility  $\chi_4(q, t)$ .

Besides the already mentioned, the most relevant observables in this work are the parallel, perpendicular and total self-van Hove functions, which are calculated, respectively, as

$$G_{s,1}(r_{\parallel}, t) = \frac{1}{N} \left\langle \sum_{j=1}^N \delta(r_{\parallel} - |\mathbf{r}_{\parallel,j}(t) - \mathbf{r}_{\parallel,j}(0)|) \right\rangle \quad (2.2)$$

$$G_{s,2}(r_{\perp}, t) = \frac{1}{N} \left\langle \sum_{j=1}^N \delta(r_{\perp} - |\mathbf{r}_{\perp,j}(t) - \mathbf{r}_{\perp,j}(0)|) \right\rangle \quad (2.3)$$

$$G_{s,3}(r, t) = \frac{1}{N} \left\langle \sum_{j=1}^N \delta(r - |\mathbf{r}_j(t) - \mathbf{r}_j(0)|) \right\rangle \quad (2.4)$$

where the symbol  $\delta$  is the Dirac delta,  $r_{\parallel}$  and  $r_{\perp}$  are, respectively, the projections of the displacement parallel and perpendicular to the nematic director  $\hat{\mathbf{n}}$ , and the angular brackets denote ensemble average over all the particles and at least 100 independent phase space trajectories starting off at regular time intervals within the same simulation run. The director  $\hat{\mathbf{n}}$  is calculated with the standard procedure of diagonalization of the traceless tensor incorporating the particles' orientation vectors [46]. The functions in Eqs. 2.2, 2.3 and 2.4 should be normalised as follows:  $\int_0^{\infty} G_{s,1} dr_{\parallel} = \int_0^{\infty} 2\pi r_{\perp} G_{s,2} dr_{\perp} = \int_0^{\infty} 4\pi r^2 G_{s,3} dr = 1$ . Finally, to assess the Fickian diffusion at long time scales, we have calculated the MSD, including that in the direction parallel and perpendicular to  $\hat{\mathbf{n}}$ . Parallel, perpendicular and total MSDs are defined in section 1.4.1.

## 2.2 Fickian diffusion and its gaussianity in nematic liquid crystals

Before introducing the details of our theoretical and computer simulation results, it is useful to recall the three main time regimes of diffusion in a colloidal suspension. At short time scales, particles diffuse through the solvent and dissipate their thermal energy as a result of the collisions with the solvent molecules. This regime is diffusive (or Fickian) and the MSD is a linear function of time, or  $\langle \Delta r^2 \rangle \propto t$ . In particular,  $\langle \Delta r^2 \rangle = 2dD_s t$ , with  $d$  the dimensionality of the move and  $D_s$  the translational diffusion coefficient of an isolated particle in a medium. At intermediate time scales, the diffusion of individual particles is slowed down by a sort of temporary cage formed by other particles [63]. The duration of this caging effect is mainly determined by the system packing and inter-particle interactions. Finally, at long time scales, the diffusion is controlled by the inter-particle collisions and the Fickian regime is recovered. In this case,

$\langle \Delta r^2 \rangle = 2dD_l t$ , with  $D_l$  the long-time translational diffusion coefficient, being in general smaller than its infinite-dilution counterpart [81].

At each of this time scales, the distribution of the particle displacements can be measured by the self-part of the van Hove correlation function,  $G_{s,d}(r,t) = 1/N \langle \sum_{i=1}^N \delta(r - |\mathbf{r}_i(t) - \mathbf{r}_i(0)|) \rangle$ , where  $N$  is the total number of particles,  $\delta$  the Dirac-delta, and  $\langle \dots \rangle$  denotes ensemble average over different trajectories. If the displacements are Gaussian distributed, then  $G_{s,d}(r,t)$  is a Gaussian function of  $r$  at all times:

$$G_{s,d}(r,t) = (4\pi D_t t)^{-d/2} \exp\left(-\frac{r^2}{4D_t t}\right), \quad (2.5)$$

where the subindex  $t$  indicates a generic dependence on time of the diffusion coefficient, such that  $D_t = D_s$  and  $D_t = D_l$  at short and long time scales, respectively. The space variable  $r$  refers to the longitudinal or radial direction in cylindrical coordinates if  $d = 1$  or  $d = 2$ , respectively, whereas it refers to the radial coordinate in spherical coordinates if  $d = 3$ . The difficulty to determine the time regimes in which a Gaussian diffusion actually holds and perform measurements at very large length and long time scales, a limit where the non-Gaussian character of Fickian diffusion is especially challenging to be proven [82], has challenged the general applicability of Eq. 2.5 to complex fluids [83].

In Fig.2.1, we report the parallel and perpendicular components of the MSD for oblate and prolate particles with shape anisotropy  $a_p = a_o^{-1} = 15.6$  in nematic LCs with packing fraction  $\eta = 0.35$ . In it we can distinguish the three mentioned timescales. At very short time scales, with  $t/\tau < 0.5$ , prolate particles diffuse faster in the direction perpendicular to  $\hat{\mathbf{n}}$  and  $\langle \Delta r_{\perp}^2(t) \rangle > \langle \Delta r_{\parallel}^2(t) \rangle$ , which is coherent with the short time (or infinite-dilution) diffusion coefficients calculated from Eq. 1.30. At intermediate times, the perpendicular mobility of this prolate particles becomes slower than the parallel mobility and an inversion in the trend observed at shorter times is observed. In particular,  $\langle \Delta r_{\perp}^2(t) \rangle < \langle \Delta r_{\parallel}^2(t) \rangle$  at  $t/\tau > 1$ .

It is then possible to observe an intermediate regime where the slope of the perpendicular component of the MSD decreases significantly. Although  $\langle \Delta r_{\perp}^2(t) \rangle$  does not reach a clear plateau as previously observed in glasses [84] or smectic phases [64–66], the transport of prolate particles in this direction shows a sub-diffusive regime, indicating the time and length scales over which particle start to

collide with other particles in the direction perpendicular to  $\hat{\mathbf{n}}$ . At long times, this component shows a diffusive regime, characterised by the long-time diffusion coefficient obtained from the slope of  $\langle \Delta r_{\perp}^2(t) \rangle$ . By contrast, the parallel component of the MSD shows a smoother behaviour, with an almost insignificant variation of the slope at intermediate times. Consequently, at long times the diffusion of prolate particles is mainly in the direction parallel to the nematic director, being the main contribution to the total MSD (not shown here). In summary, the diffusion of prolate particles in nematic LCs is clearly anisotropic with a fast and slow component in the direction, respectively, parallel and perpendicular to  $\hat{\mathbf{n}}$ . The behaviour of oblate particles with identical aspect ratio is characterised by opposite tendencies. Again, a clear anisotropy in particle diffusion is observed. Nevertheless, the fast component is the one perpendicular to  $\hat{\mathbf{n}}$ , while the slow component, which exhibits a sub-diffusive regime at intermediate times, is parallel to it.

We detect a non-Fickian (sub-diffusive) regime at intermediate time scales. But our results agree very well with previous works [41, 61, 62] and confirm

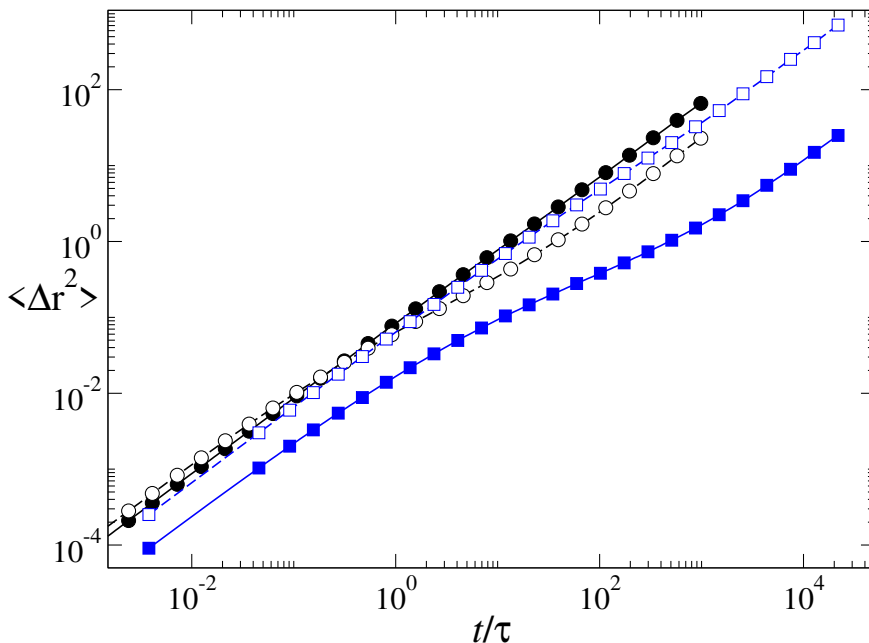


Figure 2.1: Parallel (solid lines and symbols) and perpendicular (dashed lines and open symbols) components of the MSD of prolate (black lines and circles) and oblate (blue lines and squares) particles with shape anisotropy  $a_p = a_o^{-1} = 15.6$  in nematic liquid crystals with packing fraction  $\eta = 0.35$ .



the Fickian character of the long-time isotropic diffusion, with  $D_I$ , and of the diffusion parallel and perpendicular to the nematic director  $\hat{\mathbf{n}}$ , with  $D_{I,\parallel}$  and  $D_{I,\perp}$ , calculated as showed in equation (1.38).

In the light of these preliminary considerations, we now consider whether the particle displacements as well as their parallel and perpendicular projections to  $\hat{\mathbf{n}}$  are Gaussian distributed. To this end, we calculate the parallel,  $G_{s,1}(r_{\parallel}, t)$ , perpendicular,  $G_{s,2}(r_{\perp}, t)$ , and total,  $G_{s,3}(r, t)$ , self-van Hove correlation functions, which are shown in Figs. 2.2 and 2.3) for rods and disks, respectively, at short (left frames), intermediate (middle frames), and long (right frames) time scales. In the same figures, we fit our simulation results with the Gaussian approximations calculated from Eq. 2.5, where  $D_t$  is a fitting parameter.

We observe that the Gaussian approximation to  $G_{s,1}(r_{\parallel}, t)$  and  $G_{s,2}(r_{\perp}, t)$  is very good at both short and long time scales, while, at intermediate times, where the diffusion is however not Fickian, moderate discrepancies are detected. We then conclude that at least in the direction of  $\hat{\mathbf{n}}$  and perpendicularly to it, prolate

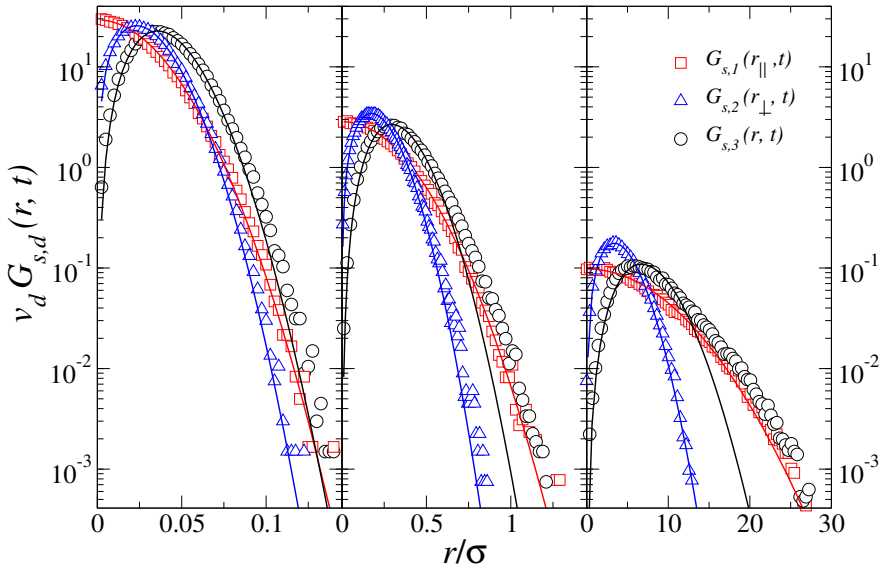


Figure 2.2: Parallel ( $\square$ ), perpendicular ( $\triangle$ ) and total ( $\circ$ ) self-van Hove correlation functions for a nematic LC of prolate particles at times  $t/\tau = 10^{-2}$  (left frame),  $t/\tau = 1$  (middle frame) and  $t/\tau = 10^3$  (right frame). Results are normalised by  $v_d = 1$ ,  $2\pi r_{\perp}$  or  $4\pi r^2$  for  $d = 1, 2$  or  $3$ , respectively. Symbols are simulation results, while solid lines are Gaussian approximations as given in Eq. 2.5, with  $D_t$  fitting parameter.

and oblate colloidal particles exhibit Fickian and Gaussian diffusion at short and long times. A more detailed analysis deserves the total self-van Hove function,  $G_{s,3}(r,t)$ , which clearly appears underestimated by the Gaussian fit at intermediate and long time scales, and less significantly also at short times (circles and black lines in Figs. 2.2 and 2.3). While at intermediate times the diffusion is not Fickian and a non-Gaussian behaviour is not astounding, at short and long times one would conclude that prolate and oblate particles follow an FNG diffusion. Nevertheless, we notice that the Gaussian approximation in Eq. 2.5 results from the integration of the Langevin equation under the assumption of a spatial isotropy, where  $D_{s,\parallel} = D_{s,\perp}$  and  $D_{l,\parallel} = D_{l,\perp}$  [81]. This assumption does not hold in a nematic LC and, more generally, in any complex fluid with anisotropic morphology.

Therefore, we propose an ellipsoidal, rather than spherical, Gaussian approximation of  $G_{s,3}(r,t)$ , where the displacements in the direction parallel and perpendicular to  $\hat{\mathbf{n}}$  are still assumed to be Gaussian distributed, but independent of

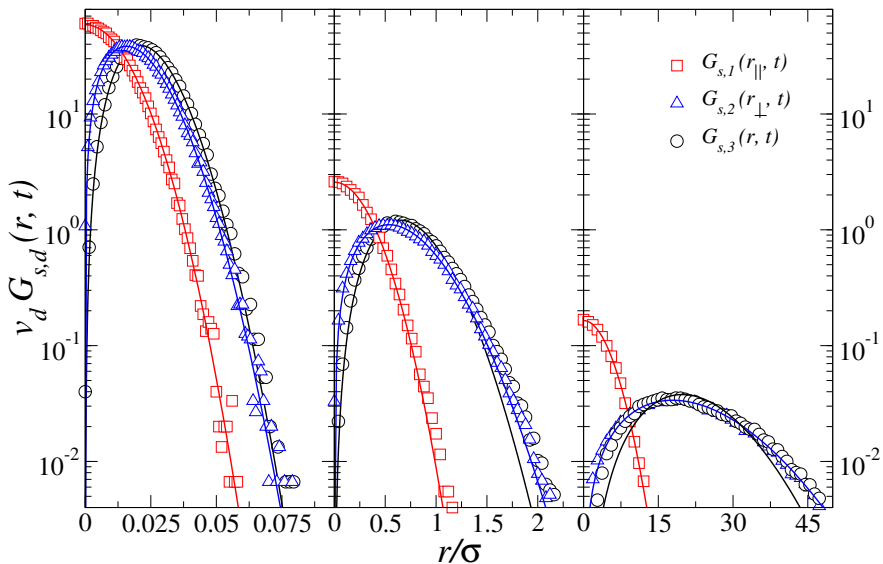


Figure 2.3: Parallel ( $\square$ ), perpendicular ( $\triangle$ ) and total ( $\circ$ ) self-van Hove correlation functions for a nematic LC of oblate particles at times  $t/\tau = 10^{-2}$  (left frame),  $t/\tau = 10.8$  (middle frame) and  $t/\tau = 2 \times 10^4$  (right frame). Results are normalised by  $v_d = 1, 2\pi r_\perp$  or  $4\pi r^2$  for  $d = 1, 2$  or  $3$ , respectively. Symbols are simulation results, while solid lines are Gaussian approximations as given in Eq. 2.5, with  $D_t$  fitting parameter.

each other [85]. The new form of the total self-van Hove correlation function is determined by combining the displacements' distributions along the parallel and perpendicular directions to  $\hat{\mathbf{n}}$  and read

$$G_s(r_{\parallel}, r_{\perp}, t) = G_{s,1}(r_{\parallel}, t) G_{s,2}(r_{\perp}, t) = \frac{1}{\left((4\pi t)^3 D_{t,\perp}^2 D_{t,\parallel}\right)^{1/2}} \exp\left(-\frac{r_{\parallel}^2}{4D_{t,\parallel}t} - \frac{r_{\perp}^2}{4D_{t,\perp}t}\right) \quad (2.6)$$

where  $G_{s,1}(r_{\parallel}, t)$  and  $G_{s,2}(r_{\perp}, t)$  have been obtained by substituting, respectively,  $d = 1$  and  $d = 2$  in Eq. 2.5. The probability to find a particle at distance  $r = (r_{\perp}^2 + r_{\parallel}^2)^{1/2}$  from its original position at  $t = 0$ , is obtained by integrating Eq. 2.6 over a spherical surface  $\Sigma$  of radius  $r$ :

$$G'_{s,3}(r, t) = \frac{\int_{\Sigma} d\Sigma G_s(r_{\parallel}, r_{\perp}, t)}{\int_{\Sigma} d\Sigma}, \quad (2.7)$$

The solution of the above integral can either take the form

$$G'_{s,3}(r, t) = \frac{\Omega}{(4\pi t)^{3/2}} \exp\left(-\frac{r^2 t^{-1}}{4D_{t,\parallel}}\right) \frac{F(r\Delta_p^{1/2})}{r\Delta_p^{1/2}} \quad (2.8)$$

or equivalently

$$G'_{s,3}(r, t) = \frac{\Omega\sqrt{\pi}}{2(4\pi t)^{3/2}} \exp\left(-\frac{r^2 t^{-1}}{4D_{t,\perp}}\right) \frac{\text{erf}(r\Delta_o^{1/2})}{r\Delta_o^{1/2}}, \quad (2.9)$$

where  $F(\dots)$  is the Dawson's integral,  $\text{erf}(\dots)$  the error function,  $\Omega = 1/(D_{t,\perp}^2 D_{t,\parallel})^{1/2}$ , and  $\Delta_p = -\Delta_o = 1/(4D_{t,\perp}t) - 1/(4D_{t,\parallel}t)$ . Eqs. 2.8 and 2.9 are mathematically

identical, being the former more suitable for prolate geometries, where  $D_{t,\parallel} > D_{t,\perp}$ , and the latter for oblate geometries, where  $D_{t,\parallel} < D_{t,\perp}$ .

The total self-van Hove functions calculated from Eqs. 2.8 and 2.9 are shown as solid lines in Fig.2.4, along with our simulation results. For comparison, we also show the Gaussian approximation of  $G_{s,3}(r,t)$  as obtained from Eq. 2.5 (dashed lines). The agreement between simulations and theoretical predictions is excellent, confirming the Gaussian nature of the Fickian diffusion at long times and thus discarding the occurrence of an FNG diffusion for the two particle geometries. We stress that the dashed and solid curves in Fig.2.4 are not fits, as the diffusion coefficients,  $D_{l,\parallel}$  and  $D_{l,\perp}$ , at long times have been obtained from the corresponding MSDs. The theoretical predictions of  $G'_{s,1}(r_{\perp},t)$  and  $G'_{s,2}(r_{\parallel},t)$  obtained from Eq. 2.5 with the instantaneous values of  $D_{l,\parallel}$  and  $D_{l,\perp}$  from the MSDs, are also in excellent agreement with the simulation results and are shown in Figs. 2.5 and 2.6 for prolate and oblate spherocylinders, respectively.

The non-Gaussian character of  $G_{s,d}(r,t)$  can also be assessed by expanding

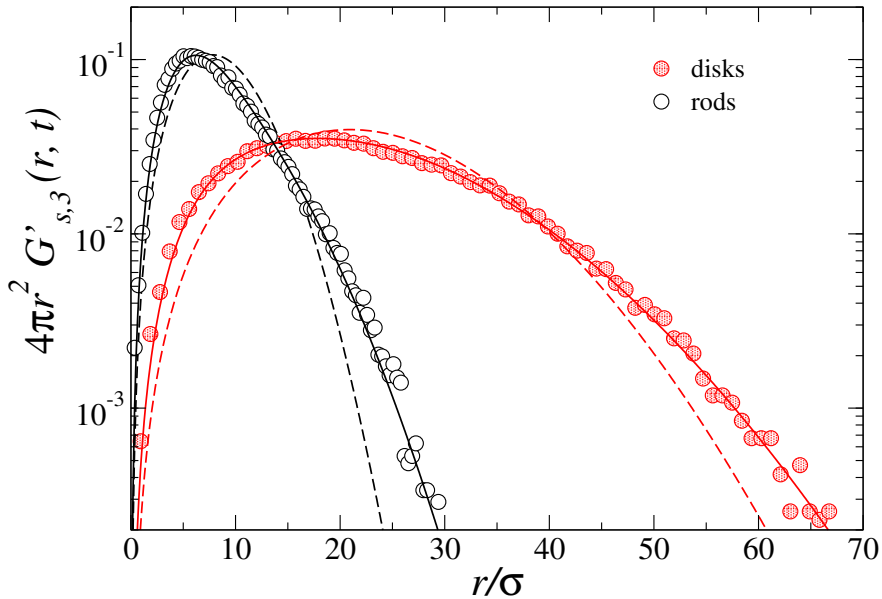


Figure 2.4: Total self-van Hove correlation functions for a nematic LC phase of rod-like and disk-like particles at  $t/\tau = 10^3$  and  $2 \times 10^4$ , respectively. Symbols are simulation results, dashed lines are Gaussian distributions obtained from Eq. 2.5, and black solid lines are Gaussian distributions obtained with Eq. 2.8 (rods) and 2.9 (disks).

this function in a series of Hermite polynomials, whose first term incorporates most of the function's non-Gaussianity in the following coefficient [86]:

$$\alpha_{2,d}(t) = \frac{\langle \Delta r^4(t) \rangle}{(1 + 2/d) \langle \Delta r^2(t) \rangle^2} - 1. \quad (2.10)$$

In particular,  $\alpha_{2,d}(t)$ , which is usually referred to as non-Gaussian parameter (NGP), vanishes if no deviations from Gaussian behaviour are observed. Parallel ( $d = 1$ ), perpendicular ( $d = 2$ ), and total ( $d = 3$ ) NGPs are plotted in Fig.2.7 for nematic phases of prolate particles. Very similar results are observed for oblate particles and are not shown here.

At short time scales,  $\alpha_{2,1}$  and  $\alpha_{2,2}$  are very close to zero, whereas  $\alpha_{2,3}$  is clearly positive even at very short times. At intermediate times, when the diffusion is not Fickian, both parallel and perpendicular NGPs are observed to increase, but this tendency is especially evident for the latter, whose maximum

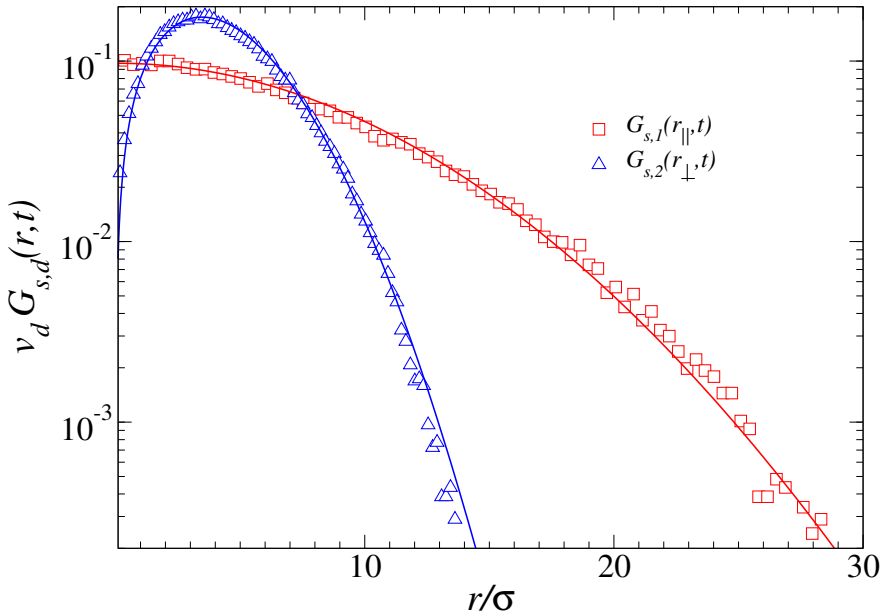


Figure 2.5: Parallel ( $\square$ ) and perpendicular ( $\triangle$ ) self-van Hove correlation functions for a nematic LC of prolate particles at  $t/\tau = 10^3$ . Results are normalised by  $v_d = 1$  or  $2\pi r_{\perp}$  for  $d = 1$  or  $2$ , respectively. Symbols are simulation results. Lines are Gaussian distributions obtained from Eq. 2.5.

value is achieved at approximately  $t/\tau = 12$ . We notice that the total NGP predicted by Eq. 2.10,  $\alpha_{2,3}$ , significantly increases in this time regime. At long times, both the parallel and perpendicular NGPs start to decrease, reaching values very close to zero. Different is the tendency displayed by  $\alpha_{2,3}$ , which seems to reach a maximum at roughly  $t/\tau = 10^2$  and then eventually decays over a time scale that goes beyond our simulation time. This result is however obtained by employing a Gaussian form of the self-van Hove function that is not able to describe the dynamics of anisotropic systems. Therefore, by following similar arguments to those illustrated above, we employ Eqs. 2.8 and 2.9 to derive an expression for the total NGP that incorporates parallel and perpendicular diffusion coefficients. To this end, we first re-write the total NGP as

$$\alpha_{2,d}(t) = K [\langle \Delta r^4 \rangle / \langle \Delta r^2 \rangle^2]_{\text{sim}} - 1, \quad (2.11)$$

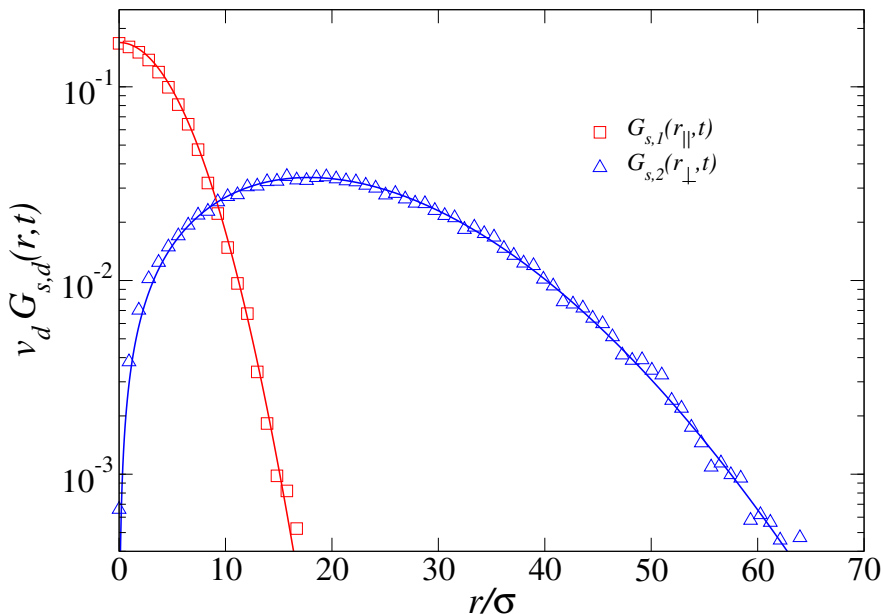


Figure 2.6: Parallel ( $\square$ ) and perpendicular ( $\triangle$ ) self-van Hove correlation functions for a nematic LC of oblates at  $t/\tau = 2 \times 10^4$ . Results are normalised by  $v_d = 1$  or  $2\pi r_\perp$  for  $d = 1$  or  $2$ , respectively. Symbols are simulation results. Lines are Gaussian distributions obtained from Eq. 2.5.

where  $K \equiv [\langle \Delta r^2 \rangle^2 / \langle \Delta r^4 \rangle]_{\text{th}}$  and the functions in  $[\dots]_{\text{sim}}$  and  $[\dots]_{\text{th}}$  are calculated, respectively, by simulation and employing the theoretical distribution of the displacements. More specifically, if we make use of the Gaussian distribution given in Eq. 2.5, then  $K$  takes the values 1/3, 1/2 or 3/5, for  $d=1, 2$  or 3, respectively, and the standard form of the NGP (Eq. 2.10) is recovered. Alternatively, if we incorporate the space anisotropy by using Eqs. 2.8 and 2.9, the theoretical values of  $\langle \Delta r^2 \rangle$  and  $\langle \Delta r^4 \rangle$  read

$$\langle \Delta r^2 \rangle = \int_0^\infty r^4 G_{s,3}(r,t) dr = (2D_{t,\parallel} + 4D_{t,\perp})t \quad (2.12)$$

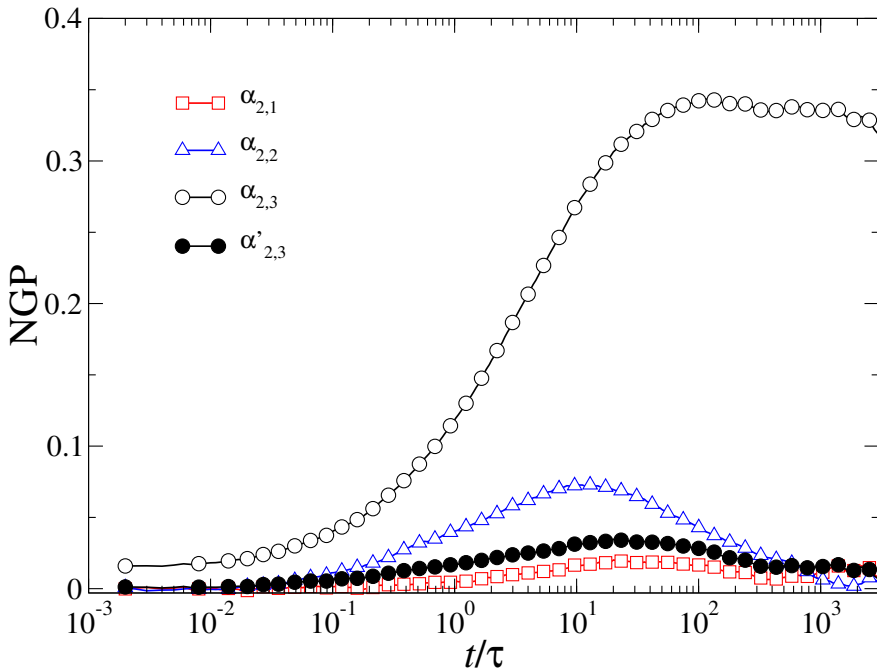


Figure 2.7: Parallel ( $\square$ ), perpendicular ( $\triangle$ ) and total ( $\circ$ ) non-Gaussian parameter for a nematic LC of prolate spherocylinders as calculated from Eq. 2.10. The solid circles ( $\bullet$ ) indicate the total NGP calculated from Eq. 2.14. Symbols are simulation results and solid lines are guides for the eye.

and

$$\langle \Delta r^4 \rangle = \int_0^\infty r^6 G_{s,3}(r,t) dr = 4 \left( 3D_{t,\parallel}^2 + 8D_{t,\perp}^2 + 4D_{t,\parallel}D_{t,\perp} \right) t^2 \quad (2.13)$$

We can now define an alternative form of the NGP, which reads

$$\alpha'_{2,3} = \frac{D_{t,\parallel}^2 + 4D_{t,\perp}^2 + 4D_{t,\parallel}D_{t,\perp}}{3D_{t,\parallel}^2 + 8D_{t,\perp}^2 + 4D_{t,\parallel}D_{t,\perp}} \frac{\langle \Delta r^4 \rangle}{\langle \Delta r^2 \rangle^2} - 1 \quad (2.14)$$

Similarly to the NGP given in Eq. 2.10, also  $\alpha'_{2,3}$  can be applied to any particle geometry. The key difference is that  $\alpha'_{2,3}$  depends on the instantaneous value of the diffusion coefficients parallel and perpendicular to  $\hat{\mathbf{n}}$ , as highlighted by the subindex  $t$  in the equations above. In particular, to calculate  $\alpha'_{2,3}$  over time, the diffusivities  $D_{t,\parallel}$  and  $D_{t,\perp}$  have been estimated from the instantaneous values of the MSD as obtained by computer simulation. We plot  $\alpha'_{2,3}$  in Fig.2.7, where it is compared to the total NGP,  $\alpha_{2,3}$ , that has been derived neglecting the anisotropy of diffusion. As already found for  $G'_{s,3}(r,t)$ , the diffusion at short time scales appears to be Gaussian, with  $\alpha'_{2,3} \approx 0$  for  $t/\tau < 10^{-1}$ . At intermediate times,  $\alpha'_{2,3}$  becomes slightly larger than zero, revealing deviations from Gaussian behaviour, which are anyway significantly softer than those detected with  $\alpha_{2,3}$  and consistent with those of  $\alpha_{2,1}$  and  $\alpha_{2,2}$ . At  $t/\tau > 10^2$ , when the diffusion recovers its Fickian nature,  $\alpha'_{2,3}$  reaches again values that are very close to zero.

## 2.3 Compared diffusion in nematic liquid crystals

In this section, we keep discussing the general characteristics of the diffusion in nematic fluids of prolate and oblate particles with (i) equal aspect ratio ( $C_1$ ), (ii) equal infinite-dilution translational diffusion coefficients ( $C_2$ ), and (iii) equal infinite-dilution rotational diffusion coefficients ( $C_3$ ). First, to analyse the relative ability of oblate and prolate particles of identical aspect ratio to diffuse in nematics, we calculate the total long-time diffusion coefficients,  $D_l^+ = (2D_{l,\perp}^+ + D_{l,\parallel}^+)/3$



and  $D_l^- = (2D_{l,\perp}^- + D_{l,\parallel}^-)/3$ , of prolate (+) and oblate (-) geometries, respectively. The resulting diffusivities show that the diffusion of prolate particles in the nematic phase is faster than that of oblate particles. This can be observed in Fig. 2.8, where we compare the parallel, perpendicular and total long-time diffusion coefficients in the nematic phase. For the sake of comparison, we also add the diffusivities obtained in the isotropic phase. The dependence of the long time rotational diffusion coefficient (details on its calculation in section 1.2.4) with the packing fraction in the isotropic and nematic phases both for prolate and oblate particles is shown in the inset of figure 2.8. The qualitative behaviour of  $D_{rot}$  is very similar in the two phases. More specifically, in the isotropic and nematic phases and for both oblate and prolate spherocylinders,  $D_{rot}$  decays at increasing  $\eta$ . This inverse dependence on  $\eta$  is stronger in the isotropic than in the nematic phase. In general,  $D_{rot}$  is smaller for oblate than for prolate particles, further confirming that the dynamics of oblate particles is slower than that of prolates. The analysis of the rotational diffusion coefficients does not indicate the occurrence of the non-monotonic behaviour observed for the translational diffusion coefficients.

As far as the nematic phase is concerned, the total diffusion coefficient of prolate particles is at least twice as large as that of oblate particles, depending on the packing of the phase. Of the same order of magnitude is the ratio between the main diffusivities of the two geometries, that is  $D_{l,\parallel}^+ \approx 3D_{l,\perp}^-$ . If one compares the minor contributions to the total particle diffusivity, prolate geometries are still faster, with  $D_{l,\perp}^+ > D_{l,\parallel}^-$ , especially at particularly large packing fractions, where the diffusion of oblate spherocylinders along the director decreases dramatically.

The dependence of the diffusivities in the nematic phase on the packing fraction does not appear to be monotonic. In particular, the total diffusion coefficients gradually increase with the system density up to a maximum, beyond which an inverse correlation is found. This tendency is the result of a non-monotonic behavior of the main contributions,  $D_{l,\parallel}^+$  and  $D_{l,\perp}^-$ , to the total diffusivity, while the minor contributions,  $D_{l,\perp}^+$  and  $D_{l,\parallel}^-$ , only decrease with increasing  $\eta$ . This behaviour, especially clear in the case of oblate particles, had been reported before by de Miguel and co-workers for prolate particles with smaller anisotropy than that studied here [61], and by Jabbari-Farouji for infinitely thin disks [62].

Between  $\eta = 0.15$  and  $0.2$ , a phase transformation of the isotropic to the prolate nematic ( $N^+$ ) or oblate nematic ( $N^-$ ) phase is observed. The isotropic to nematic phase transition produces an interesting increase of the diffusion coefficients, regardless of the particle anisotropy. In Fig. 2.8, one can see that the diffusivity of prolate and oblate spherocylinders decreases in the isotropic phase

with increasing packing fraction, but increases again when the phase transformation is produced. This abrupt change is most likely the consequence of the structural characteristics of the nematic phase. More specifically, the isotropic to  $N^+$  transition produces the formation of quasi unidimensional channels that act as preferential paths for particle diffusion. The effect is similar for oblate particles, although such preferential paths are found in planes perpendicular to  $\hat{\mathbf{n}}$  and thus are quasi two-dimensional. By contrast, in the directions perpendicular to these channels, the probability of collisions between particles is significantly higher. Although such preferential channels boost the diffusion of prolate and oblate particles in the parallel and perpendicular direction, respectively, to  $\hat{\mathbf{n}}$ , at increasing packing fractions, they become narrower and narrower and end up hampering, rather than promoting, particle diffusion. This produces the reduction of the diffusion coefficients observed in Fig. 2.8. We notice that the maximum in  $D$  is not observed in systems of infinitesimally thin disks [62], where the preferential

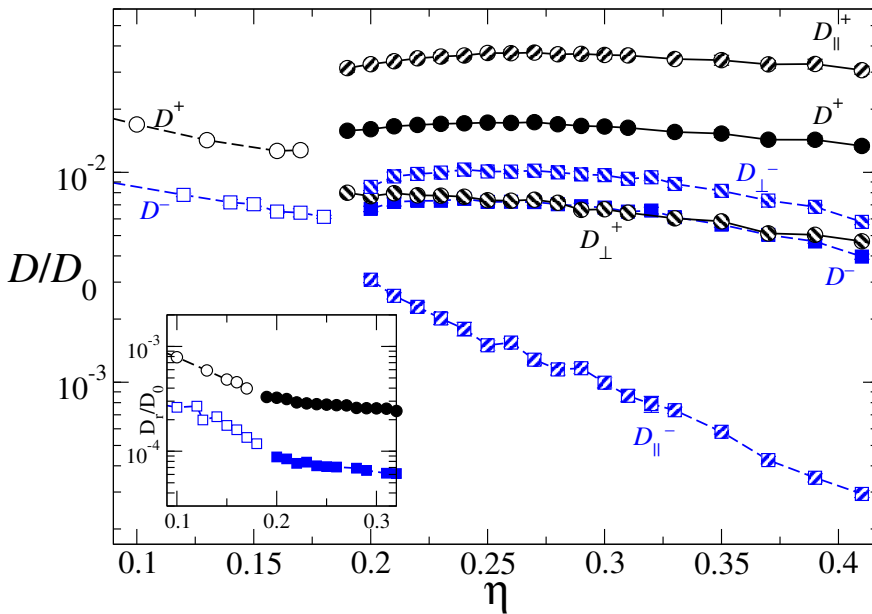


Figure 2.8: Parallel, perpendicular and total diffusion coefficients of prolate (circles) and oblate (squares) spherocylinders as a function of the packing fraction. In the same way, inset shows the rotational diffusion coefficient. Shape anisotropy:  $a_p = a_o^{-1} = 15.6$ . Open symbols refer to the diffusion in the isotropic phase, whereas solid and striped symbols refer to the diffusion coefficients calculated in the nematic phase, as indicated by the labels.

channels of the  $N^-$  phase would never get thinner, at increasing packing fraction, than the particles themselves.

In the light of these results, we now explore the diffusion of prolate and oblate spherocylinders whose infinite-dilution translational diffusion coefficients are the same, namely  $D_s^+ = D_s^-$  or, equivalently,  $D_{s,\parallel}^+ + 2D_{s,\perp}^+ = D_{s,\parallel}^- + 2D_{s,\perp}^-$ . This condition is satisfied by the prolate and oblate particle aspect ratios  $a_p = 27$  and  $a_o = 0.1$ , respectively. Additionally, we have also investigated the case of oblate and prolate particles with identical infinite-dilution rotational diffusion coefficient, that is  $D_{s,\vartheta}^+ = D_{s,\vartheta}^-$  (See equation 1.30). For the same oblate anisotropy, that is  $a_o = 0.1$ , this condition is met for  $a_p = 15.6$ . The common tendency observed in systems of oblate and prolate particles is that a more pronounced anisotropy (smaller  $a_o$  or larger  $a_p$ , respectively) determines a slower dynamics along  $\hat{\mathbf{n}}$  and perpendicularly to it. This behaviour was expected. What we want to understand here is whether or not the relative mobility of prolate and oblate particles changes when an equivalence of diffusivities, rather than a geometric equivalence, is imposed. To this end, in Fig.2.9, we report the ratio between the total MSD of

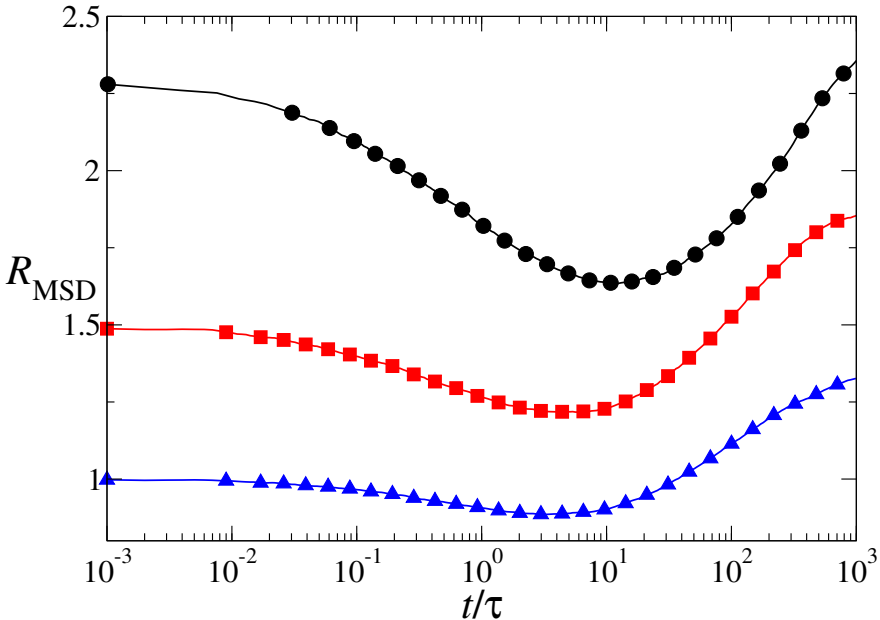


Figure 2.9: Ratio between the MSD of prolate and oblate spherocylinders with identical infinite-dilution translational (blue triangles) and rotational (red squares) diffusion coefficients. For comparison, we also show  $R_{\text{MSD}}$  for the case of identical aspect ratios (black circles). The packing fraction is  $\eta = 0.35$  in all systems.

prolate and oblate spherocylinders calculated for the three cases explored here. In particular, circles, triangles and squares show  $R_{\text{MSD}} \equiv \langle \Delta r^2 \rangle_{\text{p}} / \langle \Delta r^2 \rangle_{\text{o}}$  for the cases  $C_1$ ,  $C_2$ , and  $C_3$ , respectively. The general trend unveils that  $R_{\text{MSD}}$  decreases at intermediate times, more or less significantly for the three cases studied, and then increases again until a saturation plateau that is expected to be observed at long time scales, beyond our simulation time. Of particular relevance is the case scenario  $C_2$ , where  $R_{\text{MSD}} < 1$  over almost three time decades, specifically between  $t/\tau = 10^{-2}$  and 40. In this time window, the diffusion of oblate particles is slightly faster than that of prolate particles, a behaviour that is not observed in  $C_1$  and  $C_3$ , where  $R_{\text{MSD}} > 1$  over the complete timeline explored. These two cases would indicate that prolate spherocylinders are constantly faster than oblate spherocylinders. However, this conclusion, as we show here, strongly depends on the assumptions made and does not hold if the infinite-dilution translational diffusivities of oblate and prolate spherocylinders are the same.

These considerations are confirmed by the analysis of the self-intermediate scattering function,  $F_s(q, t)$ , which quantifies the structural relaxation of the sys-

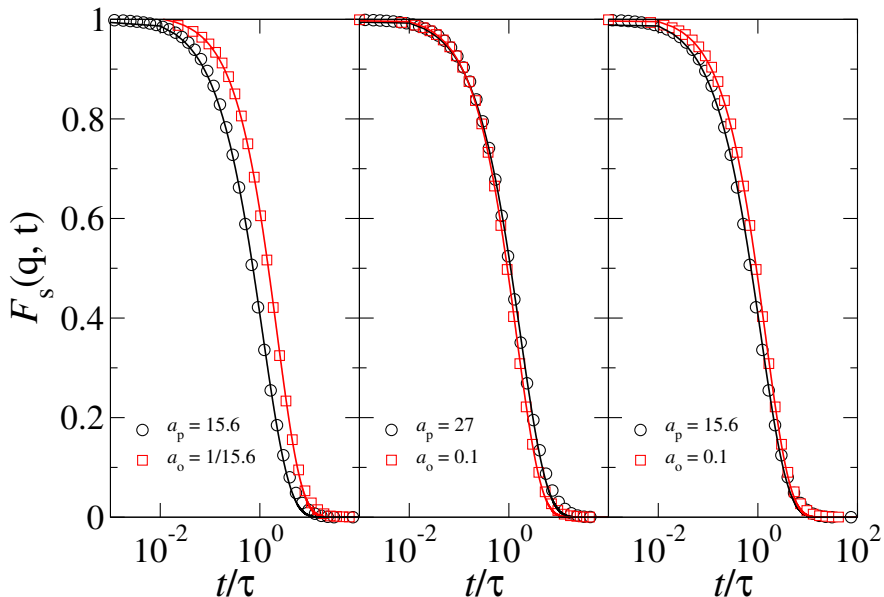


Figure 2.10: (Color online). Total self-intermediate scattering function  $F_s(q, t)$  for prolate (black circles and lines) and oblate (red squares and lines) particles for the cases  $C_1$  (left frame),  $C_2$  (middle), and  $C_3$  (right) in nematic liquid crystals with packing fraction  $\eta = 0.35$ . The solid lines are exponential fits.

tem over time. The  $s$ -ISFs of oblate and prolate spherocylinders for the cases  $C_1$ ,  $C_2$ , and  $C_3$  are displayed in Fig.2.10, being all calculated at  $|\mathbf{q}| = 2\pi/\sigma$ , corresponding to the position of the nearest neighbouring particles. The complete set of  $s$ -ISFs shows a typical fluid-like behaviour, with a single decay that is well fitted by a slightly stretched exponential function of the form  $\exp[-(t/\tau)^\alpha]$ , with  $\alpha \approx 0.80$  and  $0.88$  for prolate and oblate spherocylinders, respectively. Left and right frames, which refer to the cases  $C_1$  and  $C_3$ , suggest a faster relaxation dynamics of prolate particles as compared to oblate particles. This is especially evident for  $C_1$  (left frame), while for  $C_3$  (right frame) the relaxation of both oblate and prolate particles is very similar, although slightly faster for the latter. An opposite trend is detected for  $C_2$ , where the  $F_s$  decay of oblate particles slightly anticipates that of prolate particles.

The stretched exponential decay of the self-ISFs would suggest a heterogeneous signature of the long-time relaxation dynamics, with single particles trapped in transient cages formed by their neighbours. Two possible scenarios might explain such a non-exponential relaxation behaviour: a heterogeneous scenario in which the particles relax exponentially at different relaxation rates, and a ho-

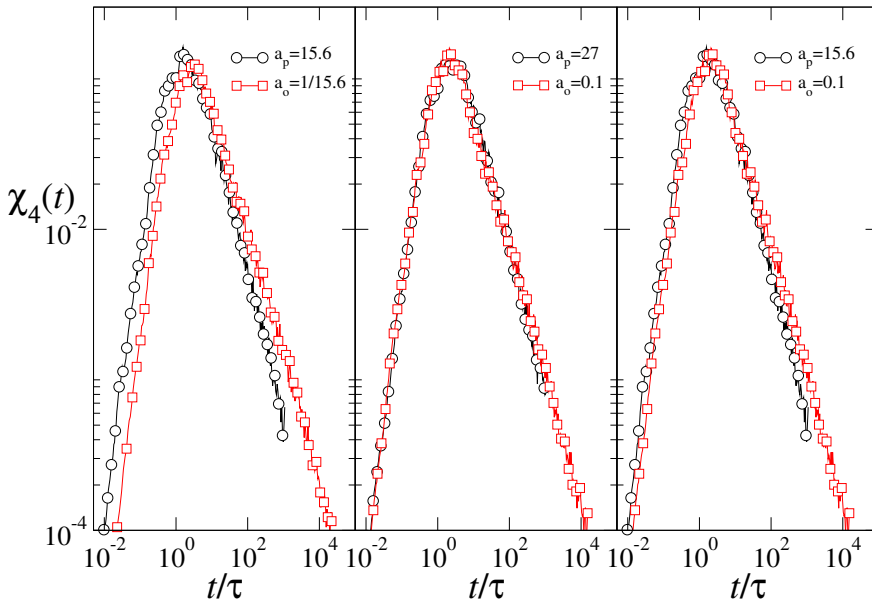


Figure 2.11: (Color online).  $\chi_4(q, t)$  at  $q = 2\pi/\sigma$  for prolate (black circles and lines) and oblate (red squares and lines) particles for the cases  $C_1$  (left frame),  $C_2$  (middle), and  $C_3$  (right) in nematic liquid crystals with packing fraction  $\eta = 0.35$ .

mogeneous scenario with the particles relaxing in a non-exponential manner at nearly identical rates [87, 88]. In the latter case, a decreasing  $\alpha$  would imply increasing cooperativity, namely a collective motion of particles contributing to the relaxation of the system.

Although the fitting coefficient  $\alpha$  is not significantly lower than 1, we addressed the possible occurrence of a collective dynamical behaviour by calculating the four-point susceptibility function,  $\chi_4(q, t)$ , which quantifies the magnitude of spontaneous fluctuations of the system dynamics as specified in Eq. 1.38 [47–49]. The resulting four-point susceptibilities calculated for oblate and prolate spherocylinders at  $|\mathbf{q}| = 2\pi/\sigma$ , in each compared case are shown in Fig.2.11. Since  $\chi_4(q, t)$  represents the average number of particles that are spatially correlated over time, its very small magnitude over the six decades explored clearly indicates that the dynamics are not cooperative, regardless the anisotropy and diffusion coefficients of the particles. In other words, the relaxation dynamics of nematic LCs relies entirely on the ability of individual particles to diffuse through their neighbours, with no sign a cooperative behaviour as previously observed in smectic LCs [64, 65].

## 2.4 Conclusions

In summary, we have investigated the dynamics in nematic liquid crystal phases of anisotropic particles, here modelled as oblate and prolate spherocylinders that confirm previous results [61, 62] and enrich the global picture of transport of particles in the nematic phase. In particular, our comparative study unveils that the generally accepted ability of prolate particles to diffuse faster than their oblate counterparts strongly depends on how this comparison is practically operated. The structural features of this phase have a strong impact on the diffusion of particles, which abruptly increases across the isotropic-to-nematic transition. Despite the stretched exponential decay of the s-ISFs, which might imply the presence of collective motion, the analysis of the four-point susceptibility function,  $\chi_4(q, t)$ , does not reveal any tangible signature of spatial correlations and thus excludes the occurrence of cooperative dynamics.

To have further insight we compared prolate and oblate spherocylinders with identical infinite-dilution translational diffusion coefficients, finding that the dynamics of oblate particles is faster in a significant time window as the MSD indicates. Additionally, under these conditions, the decay of the corresponding s-ISFs suggests a faster relaxation of systems of oblate particles. The diffusion

in the nematic phase, regardless of the particle geometry, displays a strong directional character, with a fast and slow component. It is remarkable that the relative relevance of the diffusion in the direction parallel and perpendicular to the nematic director is interchanged between prolate and oblate particles, being faster the diffusion parallel to the director in calamitic nematic fluids, while this role is taken by the perpendicular diffusion in discotic particles.

This system also gave us a good opportunity to study the impact of space anisotropy in Fickian diffusion and its gaussianity. Concluding that FNG diffusion is not ubiquitous in soft matter. More explicitly, we found that colloidal particles in nematic LCs display a Fickian and Gaussian dynamics at short and sufficiently long time scales, while at intermediate times when the particles experience a caging effect imposed by their neighbours, the diffusion is sub-diffusive and non-Gaussian. We have shown that the Fickian and Gaussian dynamics of colloidal nematic LCs cannot be appreciated by a distribution function of particle displacements that assumes space symmetry and calculated via the standard self-van Hove correlation function. To overcome this limitation, we propose an ellipsoidal Gaussian distribution that takes into account the diffusion coefficients parallel and perpendicular to the nematic director. This new distribution function is able to reproduce our simulation results with remarkable precision and is crucial to understand the nature of the diffusion in colloidal LCs, which does not show evidence of an FNG signature. The new form of the self-van Hove functions is applied to formulate a non-Gaussian parameter that incorporates the instantaneous value of the diffusion coefficients and is able to quantify deviations from Gaussian behaviour more precisely.

## The OGBK model. Possibilities, limitations and new phases

Digging in the history of the study of intermolecular forces, we find one of the first attempts to understand them in the capillarity forces studied by Clairault (1743), then he found uncanny that forces between particles appeared only between water and glass and only in their interfacial annulus. His attempt to solve this problem and the ones by other great scientists put a gravitational origin in the interaction between the constituents of matter. And it wasn't until the quantum theory of long-range forces and the London formulas (1930) when the true nature of intermolecular forces began to be understood [89].

But often, the problems we would like to solve are too big to be solved by means of quantum mechanics. So we are forced to simplify electrons interactions up to the level of the Born-Oppenheimer approximation, this means we can use empirical force fields where atomic bonds are treated as springs which stretch, bend or twist, keeping a surprisingly good performance and employing much less computing time. In this same spirit, we can keep up this approximation and omit bonded interactions of atoms and focus now on the non-bonded ones. All these simplifications will lead us to the coarse grain force fields, where we can address electrostatic or van der Waals forces separately.

On one side, the electronegativity of atoms present in a molecule can cause an anisotropic distribution of charge. This is usually modelled with point charges whose amount and position are controlled by parameters that fit the overall electrostatic interaction as a sum of pairs of charges interacting by Coulomb's law. But in cases where we find a non-zero electric moment, a central multipole expansion can be more convenient, using dipoles, quadrupoles, octopoles, etc.



Whereas on the other side, the van der Waals forces are often understood as a balance between long-range attractive forces and short-range repulsive ones. On one hand, the dispersive forces sometimes called London forces, are due to the formation of instantaneous dipoles caused by fluctuations. For them, Drude proposed a model predicting a dispersion interaction proportional to  $1/r^6$  for the dipole-dipole case, that can be extended to quadrupoles or higher orders with a series expansion. On the other hand, the repulsive contributions can be attributed to the Pauli principle, producing overlap forces in electrons with the same spin. One of the most used functions to take care of both interactions is the Lennard-Jones function, which in its more general form can be written as:

$$U(r) = k\varepsilon [(\sigma_p/r)^n - (\sigma_p/r)^m]; \quad k = \frac{n}{n-m} \left(\frac{n}{m}\right)^{m/(n-m)} \quad (3.1)$$

Being  $m$  and  $n$  two natural numbers,  $\sigma_p$  the collision parameter and  $\varepsilon$  the well depth. While choosing  $m=6$  has the aforementioned theoretical motivation, choosing  $n=12$  has no particular one, but it gives nice results for rare gases, meanwhile it would be too steep for more complex systems where an exponential decay as  $\exp(-2r/a_0)$ , being  $a_0$  the Bohr radius, is predicted by quantum mechanics [90]. Many modifications of it end in good empirical force fields where the term with the  $(1/r)^{12}$  dependence is substituted by something more suitable, like the Buckingham Potential, but even a simple 12-10 Lennard-Jones can be used to model hydrogen bonding, like the YETI force field [91]. Often the understanding of the evolution and previous uses of a function can help us to foresee further applications of it. So in order to assess the applicability of the forcefield employed in this study, the OGBK (Oblate-Gay-Berne-Kihara) model [27], we will focus on the components exposing them chronologically.

We should start more than sixty years ago when Taro Kihara proposed a core potential of intermolecular forces of non-polar polyatomic molecules [92]. There he introduced a parameter modifying the usual Lennard-Jones potential to express the minimum distance ( $d_m$ ) between impenetrable molecular cores, what is a fair coarsed-grain approximation using convex cores.

$$U_K(d_m) = 4\varepsilon \left[ (\sigma_p/d_m)^{12} - (\sigma_p/d_m)^6 \right] \quad (3.2)$$

Later on, Berne and Pechukas spoke of Kihara's potential as a model with a geometric interpretation and introduced a more analytical perspective formulating a potential using the overlap of Gaussians associated to ellipsoids of revolution representative of the space filled by molecules [93]. That model to the

contrary of many to date was differentiable and used analytical (not numerical) parameters for the pairwise interactions readily for varying degrees of anisotropy. If we take the main axis of the objects  $\mathbf{u}_i$ ,  $\mathbf{u}_j$  and their relative positions  $\mathbf{r}$ , as the vectors depicted in figure 3.1, it can be written like this:

$$U_{GO}(\hat{u}_i, \hat{u}_j, r) = \varepsilon_0 \varepsilon_{GO}(\hat{u}_i, \hat{u}_j) \exp[-R^2/\sigma^2(\hat{u}_i, \hat{u}_j, \hat{r})] \quad (3.3)$$

where  $\varepsilon_0$  is a constant and  $\varepsilon_{GO}(\hat{u}_i, \hat{u}_j)$  is the strength parameter expressed as follows:

$$\varepsilon(\hat{u}_i, \hat{u}_j) = [1 - \chi^2(\hat{u}_i \cdot \hat{u}_j)^2]^{-1/2} \quad (3.4)$$

and  $\sigma(\hat{u}_i, \hat{u}_j, \hat{r})$  the range parameter is  $\varepsilon_0$ :

$$\sigma(\hat{u}_i, \hat{u}_j, \hat{r}) = \sigma_0 \left( 1 - \frac{1}{2} \chi \left\{ \frac{(\hat{r} \cdot \hat{u}_i + \hat{r} \cdot \hat{u}_j)^2}{[1 + \chi(\hat{u}_i \cdot \hat{u}_j)]} + \frac{(\hat{r} \cdot \hat{u}_i - \hat{r} \cdot \hat{u}_j)^2}{[1 - \chi(\hat{u}_i \cdot \hat{u}_j)]} \right\} \right)^{-1/2} \quad (3.5)$$

where  $\chi$  is the anisotropy parameter defined trough the aspect ratio  $\kappa = L/\sigma + 1$  as:

$$\chi = (\kappa^2 - 1)/(\kappa^2 + 1) \quad (3.6)$$

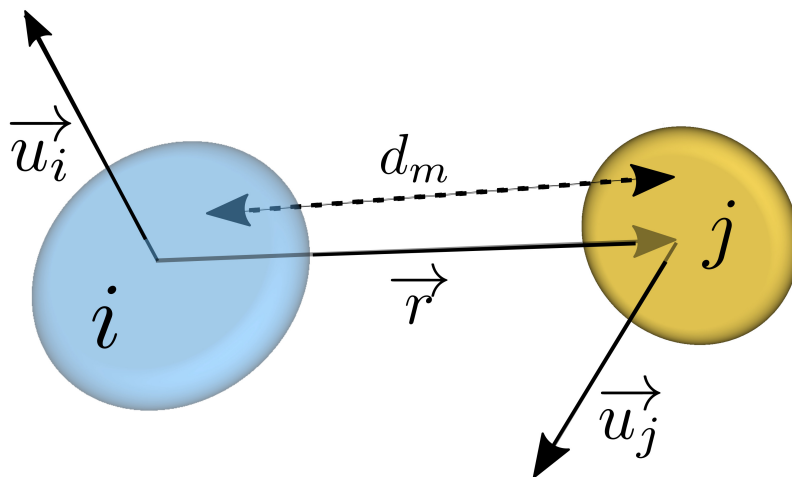


Figure 3.1: Molecules  $i$  and  $j$  with their respective unitary vectors  $\mathbf{u}_i$  and  $\mathbf{u}_j$  pointing along their revolution axis, and vector  $r$  joining their centres.

and  $\sigma_0$  usually  $\sqrt{2}$  times the perpendicular semi-axis:

Taking this Gaussian overlap potential Gay and Berne offered a modification of it to mimic a linear four site-site potential overcoming some unphysical features [28], through two changes. First introducing the range parameter inside the Lennard-Jones to displace the wells instead of dilate them. And second defining a new strength parameter  $\varepsilon_{GB}(\hat{u}_i, \hat{u}_j, \hat{r})$  which is now a function of  $\hat{r}$  as well. Respectively formulated as follows:

$$U(\hat{u}_i, \hat{u}_j, \hat{r}) = \varepsilon_0 \varepsilon_{GB}(\hat{u}_i, \hat{u}_j, \hat{r}) \left[ \left( \frac{1}{r - \sigma(\hat{u}_i, \hat{u}_j, \hat{r}) + 1} \right)^{12} - \left( \frac{1}{r - \sigma(\hat{u}_i, \hat{u}_j, \hat{r}) + 1} \right)^6 \right] \quad (3.7)$$

$$\varepsilon_{GB}(\hat{u}_i, \hat{u}_j, \hat{r}) = \varepsilon_{GO}^V(\hat{u}_i, \hat{u}_j) \varepsilon'^{\mu}(\hat{u}_i, \hat{u}_j, \hat{r}) \quad (3.8)$$

This new strength parameter is just the old one multiplied by  $\varepsilon'(\hat{u}_i, \hat{u}_j, \hat{r})$ , what is in fact  $1/\sigma^2$  where  $\chi$  was substituted by  $\chi'$ :

$$\varepsilon'(\hat{u}_i, \hat{u}_j, \hat{r}) = 1 - \frac{1}{2} \chi' \left[ \frac{(\hat{r} \cdot \hat{u}_i + \hat{r} \cdot \hat{u}_j)^2}{1 + \chi'(\hat{u}_i \cdot \hat{u}_j)} + \frac{(\hat{r} \cdot \hat{u}_i - \hat{r} \cdot \hat{u}_j)^2}{1 - \chi'(\hat{u}_i \cdot \hat{u}_j)} \right] \quad (3.9)$$

Being  $\chi'$  formulated from the strength proposed for the edge to edge configuration  $\varepsilon_e$  and the side to side configuration  $\varepsilon_s$  as follows :

$$\chi' = (\varepsilon_s^{1/\mu} - \varepsilon_e^{1/\mu}) / (\varepsilon_s^{1/\mu} + \varepsilon_e^{1/\mu}) \quad (3.10)$$

Even though the Gay-Berne potential has been extensively used for both prolate and oblate geometries, we cite here just a few applications among the most representative for this work. As could be the example of coronene [95] or other to discotic molecules [96].

The described model uses ellipsoids of revolution, what still seems inaccurate to describe the electronic clouds of molecules, this model was improved later on by Martinez-Haya and Cuetos [27], applying Kihara's perspective to it. The Lennard-Jones like part of the potential is now a function of the minimum distance between two segments for the case of a prolate and can be extended for

the case of oblates using the minimum distance between two disks. Representing now these molecular shapes as spherocylinders. (see figure 3.2).

The final expression for the potential combining equations (3.2) and (3.8) is:

$$U(\hat{u}_i, \hat{u}_j, \hat{r}) = \varepsilon_{GB}(\hat{u}_i, \hat{u}_j, \hat{r}) U_K(dm) \quad (3.11)$$

Summarizing, this simple modification we can now represent the electronic cloud of molecular discogens with very different aspect ratios or even a colloid of discotic shape. So given  $\kappa$  (particle's aspect ratio) if we define now the parameter  $\kappa' = \varepsilon_s/\varepsilon_e$  we can characterize the interaction anisotropy with only three parameters ( $\kappa'$ ,  $\nu$ , and  $\mu$ ). That would yield an attractive energy well of a parallel pair of molecules in the edge to edge configuration being  $\kappa'$  times,  $(1 - \chi^2)^{-\nu/2}$  times and  $(1 - \chi^2)^{-\nu/2}(1 - \chi')^{-\mu}$  times deeper than for the face to face, crossed and T-shaped configurations respectively(see figure3.3). The GBK has been previously used for prolate [27] and oblate [55,97] particles, but only in a reduced number of parameters' sets. Here we focus on oblate ones and explore the different usable sets in order to find further potentialities of the model.

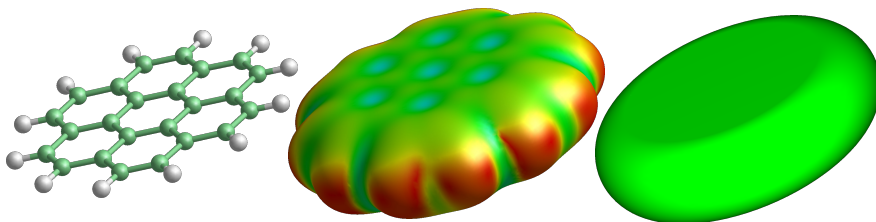


Figure 3.2: From left to right. Molecular model of coronene [94], isosurface [94] of the molecule and spherocylinder of  $a_o = 0.3$

### 3.1 Classification, Possibilities and Limitations

The  $D_{\infty,h}$  symmetry of oblate particles yields four canonical relative orientations that can be understood as the building blocks of any ordered structure composed with them. These orientations are depicted in figure 3.3 with the following nomenclature according to the position of the principal axes of the particles, referencing from the one which coincides with the revolution axis (RA) that would transform the two-dimensional curve in a three-dimensional oblate shape:

- “F” when they share RAs.
- “E” when their RAs are parallel and share another principal axis.
- “C” when their RAs are perpendicular and a different principal axis is shared.
- “T” when RAs are perpendicular, being one of them shared by another principal axis of the other.

Picking carefully the parameters in the OGBK potential we can favour any of the canonical orientations over the others, setting it as the more intense interaction. Feature that was chosen to establish a first approach towards the classification of parameters’ sets, therefore we will the nomenclature  $U_F$ ,  $U_E$ ,  $U_T$  or  $U_C$  if the configurations F, E, T or C are favoured over the others respectively, or combination of letters if two of them have the same depth and the others are shallower. This ability to control the anisotropy of the potential turns it in a powerful tool since it allows to model very different systems like cells, colloids or even polycyclic aromatic hydrocarbons. And at the same time, it represents an opportunity for

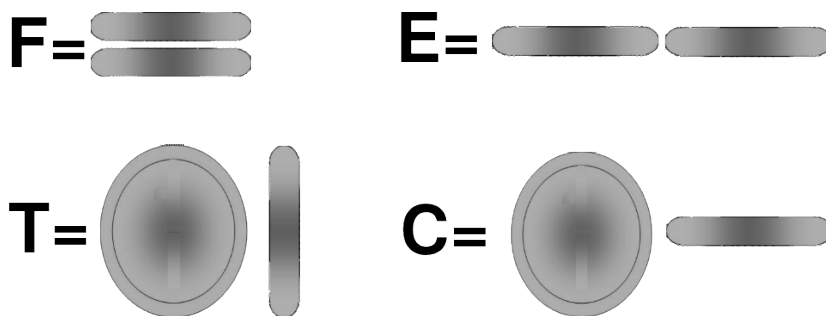


Figure 3.3: The four canonical relative orientations possible for oblates particles. F(face to face),E(edge to edge),T(“T” shape) and C(cross shape)

theoretical studies, because it allows tuning the orientational dependence of particles within a wide range of anisotropies with only three parameters. Therefore, it is easily applicable to many systems or even as a test environment to key-lock models.

The proposed classification can be better understood looking at the plots of energy as a function of the centre of mass separation in units of ( $r^* = r/(L + \sigma)$ ) (see Fig. 1.1) keeping the relative angles formed by  $\mathbf{u}_i$ ,  $\mathbf{u}_j$  and  $\mathbf{r}$ . There are presented each set of parameters separately with a curve for each of the four canonical orientations (figs. 3.4, 3.5, 3.6 and 3.7). In that sense we are fixing the angles due to their practical importance, but we should always bear in mind that we are dealing with a continuous potential as a function of the minimum distance between two disks and three angles (the RAs relative angle and the two angles that those form between each of them and the straight line passing through both centres), therefore two different sets of parameters may have wells with the same minimal values, having a different angular dependence.

The complex equation used to compute potential energy has some limitations regarding usable parameters because in some cases we might incur into unphysical situations or mathematical singularities, as it happens with  $k' < 0$ . Being also problematic many cases between  $-1 < \nu < 1$ , and  $-1 < \mu < 1$ , where even if we compute the necessary exponentiations as  $x^y = e^{y \ln(x)}$ , we could find complex numbers as a result.

With the application of the "Inverse function theorem" [98,99] we would find the domains and images of the OGBK potential but any information obtained would be difficult to visualize or understand due to the high number of variables (the three parameters for the angular dependence, the aspect ratio, minimum distance and three angles). To overcome this in a more practical way, we focused on the wells minima for the canonical orientations and performed an exploration of the input parameters to filter the ranges of interest of them. The oblate anisotropy  $a_o$  (as defined in section 1.2.1) was evaluated from 0.1 to 1.0 at 0.1 steps.  $k'$  was evaluated from 0.1 to 1.0 at 0.1 steps.  $\nu$  and  $\mu$  were evaluated from -10 to 10

$U_E$	$\kappa' < 1$	$\nu > 0$	-
$U_F$	$\kappa' > 1$	-	-
$U_T$	$\kappa' > 1$	$\nu < 0$	$a_o < 0.9$
$U_C$	$\kappa' < 1$	$\nu < 0$	-

Table 3.1: Necessary but no sufficient rules to obtain a dominant orientation OGBK potential, according to aspect ratio and parameters  $k'$  and  $\nu$

at 0.1 steps. From that we omitted wells deeper than  $50 \varepsilon$  since those would be highly unlikely to appear in a real system.

The filtering of data from the exploration yielded some necessary but no sufficient rules to obtain a desired interaction potential showed in Table 3.1, this mostly implies that even following those rules sometimes the result is a potential with all wells of the same depth within a difference of  $0.01\varepsilon$  (examples in sets 11 and 12 of Table 3.2), any  $U_T$  type (set 3) proves that rule for  $U_F$  is not warranty of it and sets 11, 12 and 13 proves the insufficiency of the rules for  $U_C$ ,  $U_T$  and  $U_E$  respectively. It is also worth mentioning that this rules and the examples of Table 3.2 arise from the described exploration, therefore a thorough investigation of the parameters may unveil more detailed results, what is out of the scope of this study.

From the exploration performed, some sets of parameters are showed in table 3.2 as extreme examples of the possibilities found ranking the well minima among the canonical orientations. From a pragmatcal point of view, some obtained potentials may result in very interesting systems to study theoretically but unfeasible in practice. The first four rows of the table show examples where the deepest well is at least 8 times deeper than any of the others, in the following we can observe special cases where at least two wells are equally deep. This is easy to understand observing the effect certain parameters have on the final expression of the potential. For example all sets where  $\kappa' = 1$  will result in wells of E and F configurations being equally deep (sets 7 and 9),  $\nu = 0$  will make wells of E and C configurations equally deep (set 6),  $\mu = 0$  will make wells of T and C configurations equally deep (sets 8,11-13). Sets 5 and 7 are examples of this hybrid types  $U_{EC}$  and  $U_{TC}$  obtained without  $\nu = 0$  or  $\mu = 0$ . Finally, sets 14 to 17 are the worked examples in this study. Is important to remark that this values for the wells are rounded up to  $0.1\varepsilon$  and also, to keep in mind that even if we find different sets which result in wells of the same depth, these are canonical configurations and the rest of values for other orientations might differ.

### 3.1.1 Structures and Self-Assembly

There is a vast amount of possible combinations of parameters so in order to show the effects of the application of this potential we limited the simulations to four characteristic sets running NPT-MC simulations along three isotherms for four sets of parameters each favouring one of the canonical orientations in a rather realistic way instead of being extreme examples. With the same spirit, all simulations were performed at  $a_o = 0.1$ . But is important to take into account that

the width of the wells in the OGBK model is controlled by the aspect ratio used, a parameter which also affects the excluded volume. These two features have a mayor impact on the aggregation process, resulting in different structures formed for the same potential along a range of the aspect ratio.

First, we ran several trials starting from the same isotropic configuration at very low density for several parameters' sets of each type (E, F, T and C). Starting from a simulation box in length units of  $D = (L + \sigma)$ , filled with  $N = 1260$  particles at  $\rho^* = 0.002N/D^3$  and pressure  $P^* = 0.0001(PD^3/\varepsilon)$  NPT-MC simulations were performed along isotherms at temperatures of  $T^* = 0.1(-U_{min})$  where  $U_{min}$  is the deepest well in each case in  $\kappa_B T$  units. To observe the formation of

Set #	$\kappa'$	$\nu$	$\mu$	$a_o$	E	F	T	C	Type
1	0.1	1.5	-10.0	0.1	-11.3	-1.1	-0.3	-1.0	$U_E$
2	10.0	0.1	0.2	0.1	-1.2	-11.7	-1.1	-1.0	$U_F$
3	10.0	-4.2	-0.2	0.1	-0.001	-0.01	-8.7	-1.0	$U_T$
4	0.1	-2.7	0.2	0.1	-0.01	-0.001	-0.1	-1.0	$U_C$
5	0.1	-0.1	0.2	0.7	-1.0	-0.1	-0.1	-1.0	$U_{EC}$
6	0.1	0.0	0.3	0.1	-1.0	-0.1	-0.1	-1.0	$U_{EC}$
7	1.0	-1.6	-0.1	0.1	-0.1	-0.1	-1.0	-1.0	$U_{TC}$
8	0.1	-1.6	0.0	0.1	-0.1	-0.1	-1.0	-1.0	$U_{TC}$
9	1.0	1.5	-10.0	0.1	-11.3	-11.3	-1.0	-1.0	$U_{EF}$
10	10.0	-0.6	-0.2	0.5	-0.9	-8.7	-8.7	-1.0	$U_{FT}$
11	0.1	-0.1	0.0	0.7	-1.0	-1.0	-1.0	-1.0	$U_{EFTC}$
12	1.1	-1.7	0.0	0.9	-1.0	-1.0	-1.0	-1.0	$U_{EFTC}$
13	0.1	9.8	0.0	1.0	-1.0	-1.0	-1.0	-1.0	$U_{EFTC}$
14	0.1	1.0	1.0	0.1	-5.0	-0.5	-0.2	-1.0	$U_E$
15	2.0	0.2	2.0	0.1	-1.4	-2.7	-1.4	-1.0	$U_F$
16	1.9	-0.4	-0.1	0.1	-0.5	-1.0	-1.8	-1.0	$U_T$
17	0.1	-1.3	0.3	0.1	-0.1	-0.01	-0.1	-1.0	$U_C$

Table 3.2: This table shows in columns; the set number (1), the potential parameters (2-4), the anisotropy (5), the minimum energy in each configuration in reduced units ( $U/\varepsilon$ ) (6-9) and the correspondent classification (10). And stores in rows, some extreme (1-4), special example sets (5-10), sets evidencing the insufficiency of the provided rules (11-13) in table 3.1 from the ranges of parameters studied and the worked examples of this study (14-17). A combination where all well minima are -1.0 can be found for many sets of parameters



aggregates in each set. The cluster move described in section 1.2.5 was useful to equilibrate densities up to around 0.1 particles per volume unit ( $\sigma^3$ ), what for  $a_o = 0.1$  usually means that all particles are in the same cluster. From that point on, the equilibration process can become unreachable due to the loss of ergodicity. This motivated a different approach to investigating phases of higher packing fraction.

With this procedure, we always found that the aggregates formed clearly manifest in their structure when the intensity of the attraction in one of the canonical orientations overcomes the others. Here we only show one example cluster for each potential type inserted in the representations of the energy for each canonical orientation (F, T, E and C) as a function of the distance of particles' centres  $r^* = (r/D)$ . For the  $U_F$  type (Fig. 3.4) we can observe particles attach to each other forming columns, which in turn are stuck because the E configuration also minimizes the energy of the system to a lesser extent. For the  $U_E$  type (Fig. 3.5)

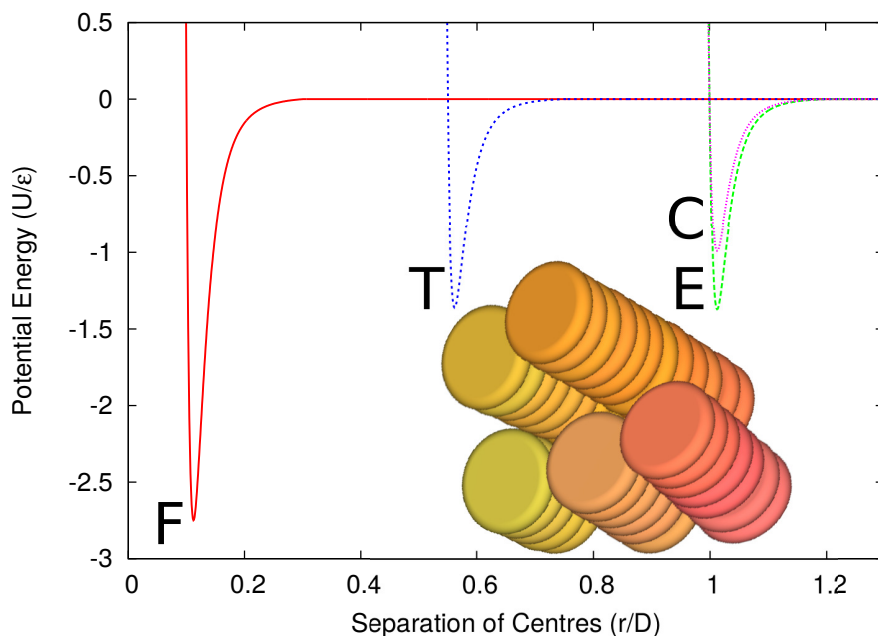


Figure 3.4: Interaction Energy in each of the four canonical configurations for the  $U_F$  type potential with parameters,  $\kappa = 0.10$ ,  $\kappa' = 2.00$ ,  $\nu = 0.20$  and  $\mu = 2.00$  with typical aggregate inserted showing the effect of having the F configuration as an energy minimum, with each curve marked with the letter of the orientation that produces it.

we can observe that particles form sheets in clusters of few layers.

In the  $U_T$  type case (Fig.3.6) we can observe intricate patterns of the structure commonly named house of cards, to describe the networks formed in clays [100, 101], in reference to this porous aggregates. In this case, is important to remark that to the contrary from previous simulation studies, here the distribution of charges of opposite signs is not modelled yet, it just happens for the T configuration to minimize the energy, as if it was a key-lock model.

Finally, for the  $U_C$  type (Fig.3.7) we can observe structures where particles tend to be surrounded by others in C configuration, resembling entangled accor-dions, of which we could not find previous reference in the literature

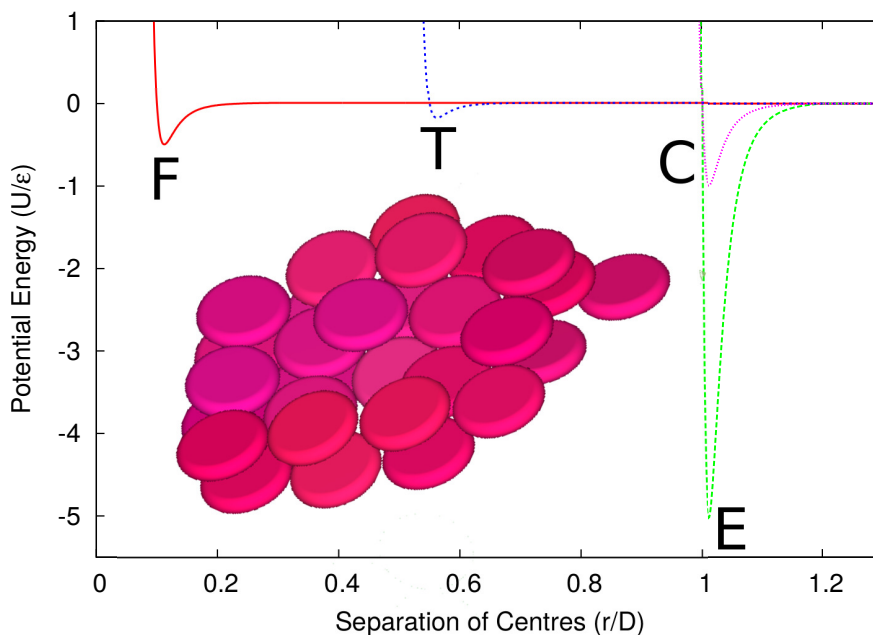


Figure 3.5: Interaction Energy in each of the four canonical configurations for the  $U_E$  type potential with parameters,  $\kappa = 0.10$ ,  $\kappa' = 0.10$ ,  $\nu = 1.00$  and  $\mu = 1.00$  with typical aggregate inserted showing the effect of having the E configuration as an energy minimum, with each curve marked with the letter of the orientation that produces it.

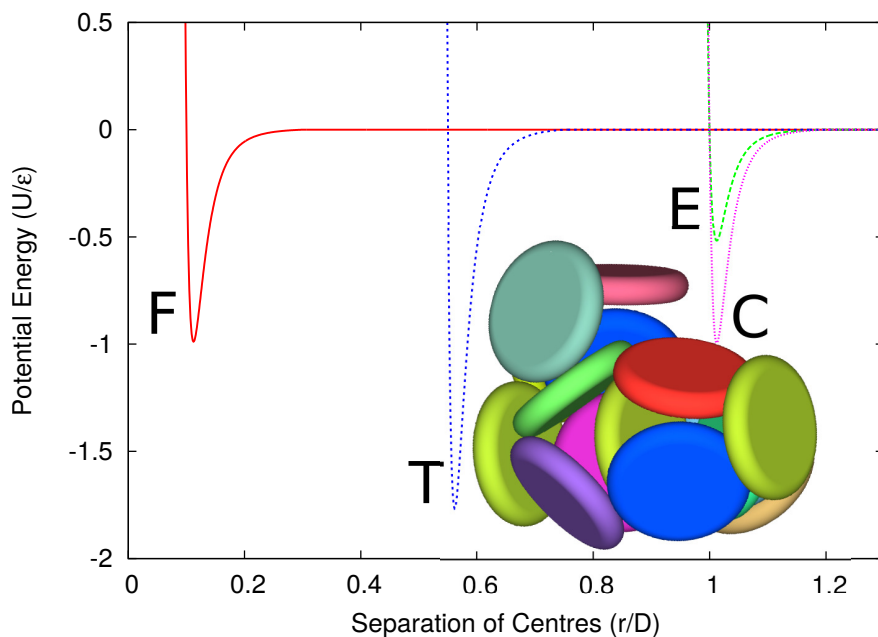


Figure 3.6: Interaction Energy in each of the four canonical configurations for the  $U_T$  type potential with parameters,  $\kappa = 0.10$ ,  $\kappa' = 1.90$ ,  $\nu = -0.40$  and  $\mu = -0.10$  with typical aggregate inserted showing the effect of having the T configuration as an energy minimum, with each curve marked with the letter of the orientation that produces it.

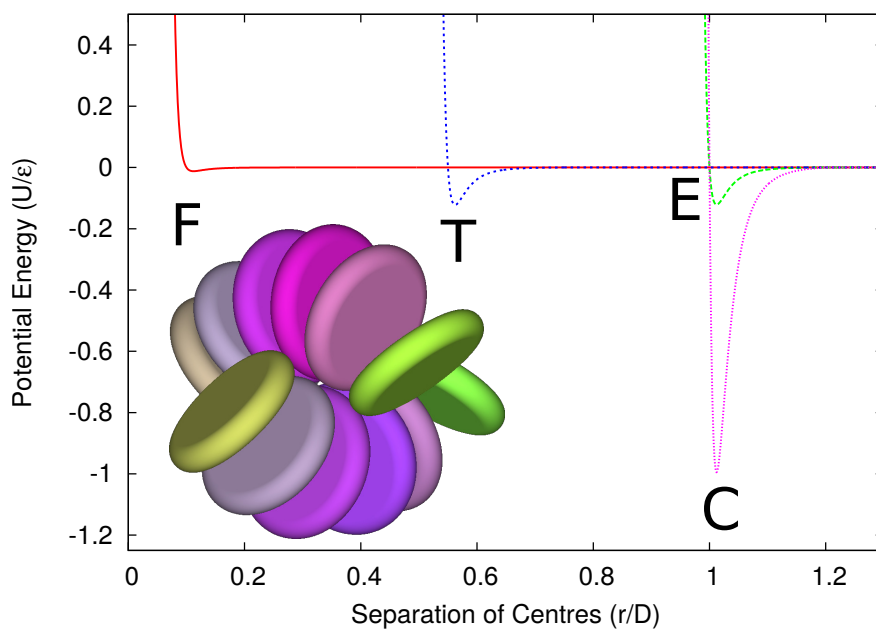


Figure 3.7: Interaction Energy in each of the four canonical configurations for the  $U_C$  type potential with parameters,  $\kappa = 0.10$ ,  $\kappa' = 0.10$ ,  $\nu = -1.30$  and  $\mu = 0.30$  with typical aggregate inserted showing the effect of having the C configuration as an energy minimum, with each curve marked with the letter of the orientation that produces it.

## 3.2 Phases and State Diagrams of characteristic potentials

In a previous study of Marechal *et al.* the phase diagram of hard oblate spherocylinders was determined for different aspect ratios and packing fractions [53]. In it we find four possible phases according to particles ordering, the isotropic phase with particles randomly oriented as it happens in liquids and gases, the nematic phase with particles roughly parallelly oriented as it is the case for liquid crystal systems, and two types of solid phases, the columnar, where particles are arranged in parallel columns, but to the contrary from the tilted phase or other solid phase, particles are not necessarily parallel within the column. We can observe an example of each one of these four phases in figure 3.9. Looking at the bibliography we can find examples of these phases obtained also when the Gay-Berne potential is applied [96] to discotic molecules. There have been also studies of the tilted phase, trying to model crystals of coronene with it [102]. But our approach tries to be less specific and give a broader perspective in terms of orientations of the interactions and their repercussion.

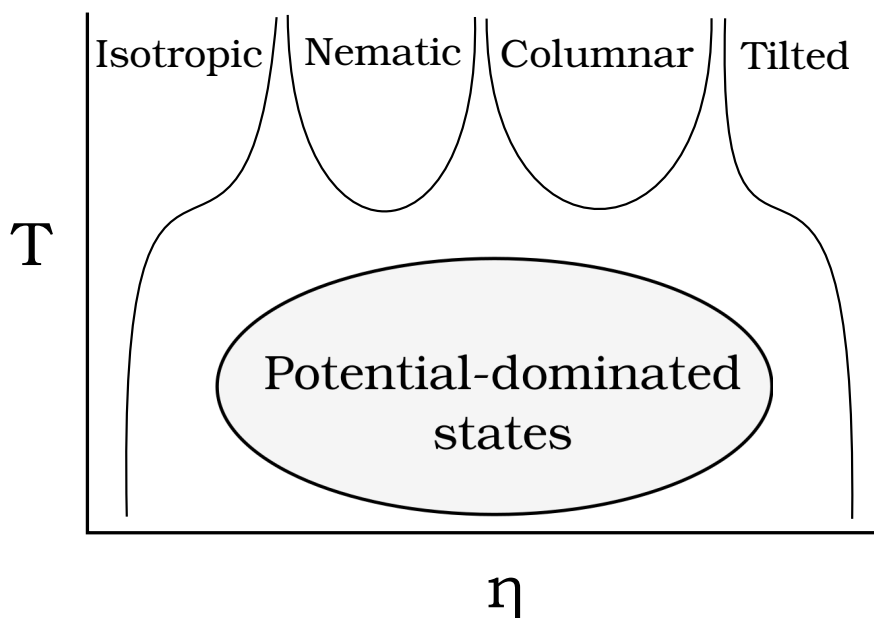


Figure 3.8: Conceptual phase diagram predicted for oblate spherocylinders of  $a_o = 0.1$  subjected to the GBK potential (for any set of parameters  $\kappa', \nu$  and  $\mu$ ).

For this study we foresaw a conceptual phase diagram (see figure 3.8) where for a high temperature, defined as  $T^* \gg -U_{min}$  being  $U_{min}$  the deepest well of the chosen potential. The phases found should be qualitatively the same as for the study of Marechal *et al.*, since particles would be freed from their attractions. Therefore, at these temperatures, we should only observe small differences in the phase diagram, because our particles behave effectively as soft oblate spherocylinders. But as the temperature decreases, a plethora of new metastable phases can appear between the highly packed tilted phase at high pressures (where the entropic term governs the free energy) and the isotropic phase at very low pressures. Under already mentioned conditions of temperature and pressure for metastable phases, particles are trapped into regions of the phase space during an unpredictable amount time, resulting in a loss of ergodicity, provoking a huge hysteresis in the simulations.

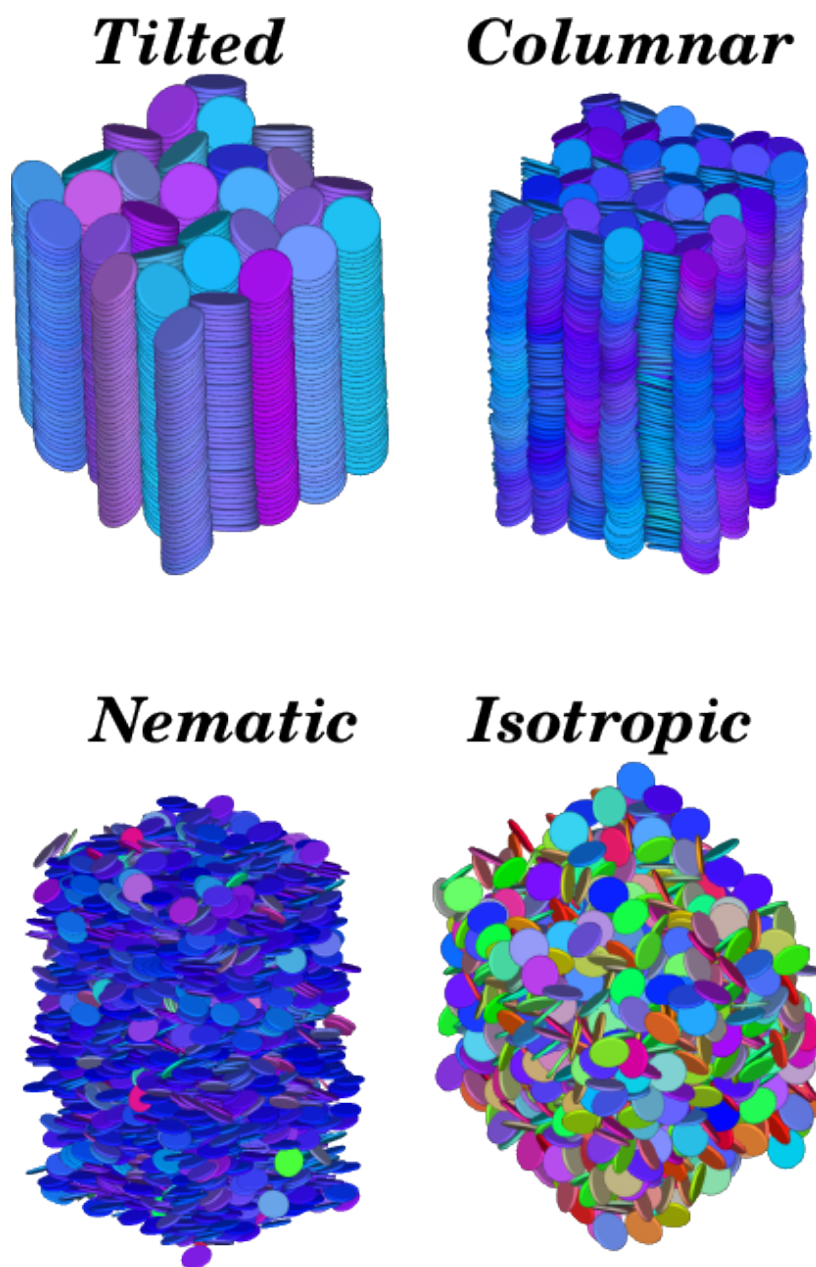


Figure 3.9: Snapshots of phases obtained at high temperatures for oblate spherocylinders under GBK interactions. These phases are also found for hard oblates of the same anisotropy  $a_o = 0.1$  (colours depicting particles orientations)

### 3.3 Simulations Details

According to the predicted phase diagram we decided to run MC simulations in the NPT ensemble along three isotherms for every chosen set of parameters. One at a temperature  $T^* = -2U_{min}$ , one at  $T^* = -1U_{min}$  and one at  $T^* = -0.5U_{min}$ , where  $U_{min}$  is again the deepest well of each set (see table 3.2). To have a common framework all temperatures displayed are scaled with  $\varepsilon$  (see equation 3.1) as  $T^* = \kappa_B T / \varepsilon$ . After the observation of hysteresis in the system during previous test, we chose to perform MC simulations in the Isotension-Isothermal ensemble for every desired pressure with a constant number of particles  $N = 1260$ , picking a highly packed tilted phase as the starting point of every one and allowing changes in shape and volume as described in section 1.2.3 until equilibration. As a test, we checked that starting from a columnar configuration we can arrive to the same phases under the same conditions of pressure and temperature, with the caveat that the tilted phase takes much longer to be equilibrated under this initial configuration.

### 3.4 Results

The results of our simulations are aligned with our prediction of the phase diagrams. For isotherms at high temperatures we could only find the same phases hard oblate spherocylinders have in their phase diagram at an anisotropy of  $a_o = 0.1$  in the four cases (see figures 3.10, 3.11, 3.14 and 3.16). For the isotherms at medium and low temperature every type of potential deserves a separate discussion.

At medium or low temperatures we found structures that were stable for more than  $10^6$  MC cycles at intermediate pressures. This means different types of ordering favoured by the minimization of energy, this entails the metastability of the columnar phase at lower pressures than expected for it in the F type potentials. Meanwhile, for the T, C and E types, it meant the appearing of the Uniaxial (Fig.3.15), Cubatic (Fig.3.17) and Discotic-Smectic (Fig.3.12) phases respectively. This last two has been previously reported by several authors for different particles like [103–105]. And the type of aggregation found in T type potentials is present in many systems, from cells [106] to asphaltenes [107] or simpler polycyclic aromatic hydrocarbons [108] but our model offers the possibility to engineer their self-assembly simply by choosing the set of parameters wisely.

Though at intermediate pressures these systems are hard to equilibrate, the  $U_F$



potential type does not offer any metastable phase at the temperatures investigated after  $10^6$  cycles. The isotherms of this potential have a common feature with the others, having a stable isotropic phase with increasing temperature at low packing fractions, corroborating the assumption of our conceptual phase diagram. The region of the isotherms occupied by metastable phases for other types of potential is filled here with the columnar phase. This was to be expected since this configuration minimizes the energy of the system, this fact also pushes the tilted phase to higher pressures (see fig.3.10).

The low-temperature simulations of the  $U_E$  potential allowed us to find the Discotic-Smectic phase (see fig.3.12) for oblate particles at lower aspect ratios than obtained in previous studies [105], because in our case this phase does not arise from entropic reasons as it happens for hard particles of higher aspect ratios. The Discotic-Smectic phase in fluids of discotic particles has been reported very few times in both experimental [109–111], and simulation studies of parallel particles or oblate particles with non-discotic shape [112, 113]. This is proof of the versatility of the OGBK potential to model different kind of fluids. At this tem-

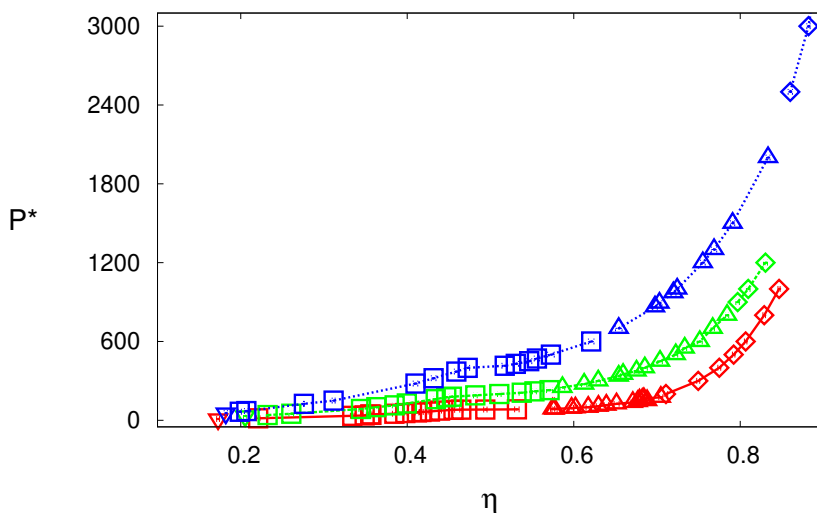


Figure 3.10: Isotherms of the  $U_F$  type potential with parameters,  $\kappa = 0.10$ ,  $\kappa' = 2.00$ ,  $\nu = 0.20$  and  $\mu = 2.00$ , showing pressure  $P^*$  in reduced units as a function of packing fraction  $\eta$  at temperatures  $T^* = 1.38$ ,  $T^* = 2.75$  and  $T^* = 5.50$  in solid (red), dashed (green) and dotted (blue) lines respectively. (Error bars within the points size). Where symbols show different phases as,  $\square$  for nematic,  $\nabla$  for isotropic,  $\triangle$  for columnar and  $\diamond$  for tilted phase.

perature, we can also observe the persistence of the nematic phase over a wider range of pressure.

We were able to characterize this phase using parallel and perpendicular distribution functions, showing the layering of the system as can be observed in the figure, with a periodicity similar to the thickness of the particles. Meanwhile, there is no evidence of columns (see fig.3.13).

The effect of the  $U_T$  type potential at medium temperatures was the absence of the columnar phase. This shocking feature is shared with isotherm simulated at medium temperature for the  $U_C$  type potential. In both cases, it seems that columns break in order to minimize the energy adopting the more convenient orientation according to each type of potential. For the case of  $U_T$  at lower temperatures, this means the formation of the Uniaxial phase, where persistent chunks of columns are stably trapped by the surrounding particles in a T orientation. This yields a population of particles sharing a common orientation and another one which takes any of the perpendicular ones(see fig.3.15).

In the case of the  $U_C$  type potential, particles in the tilted phase are close to

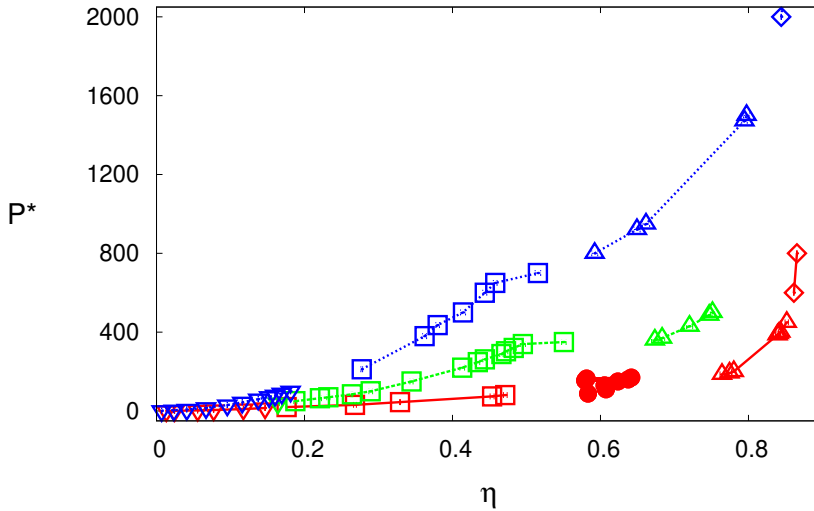


Figure 3.11: Isotherms of the  $U_E$  type potential with parameters,  $\kappa = 0.10$ ,  $\kappa' = 0.10$ ,  $\nu = 1.00$  and  $\mu = 1.00$ , showing pressure  $P^*$  in reduced units as a function of packing fraction  $\eta$  at temperatures  $T^*=2.50$ , 5.00 and 10.00 in solid (red), dashed (green) and dotted (blue) lines respectively. (error bars within the points size). Where symbols show different phases as,  $\square$  for nematic,  $\nabla$  for isotropic,  $\triangle$  for columnar,  $\diamond$  for tilted and  $\bullet$  for Discotic-Smectic phase.

the C canonical orientation. This is responsible for the unexpected low packings and high temperatures to which it remains stable and also for the aforementioned

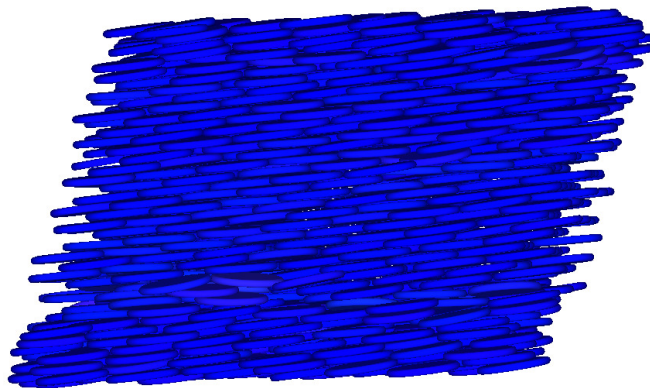


Figure 3.12: Snapshot of a discotic Discotic-Smectic configuration obtained under the chosen potential  $U_E$  at  $T = 2.5$  and  $P = 88$ , where we can observe the layers disposition of oblate spherocylinders (colours depicting particles orientations).

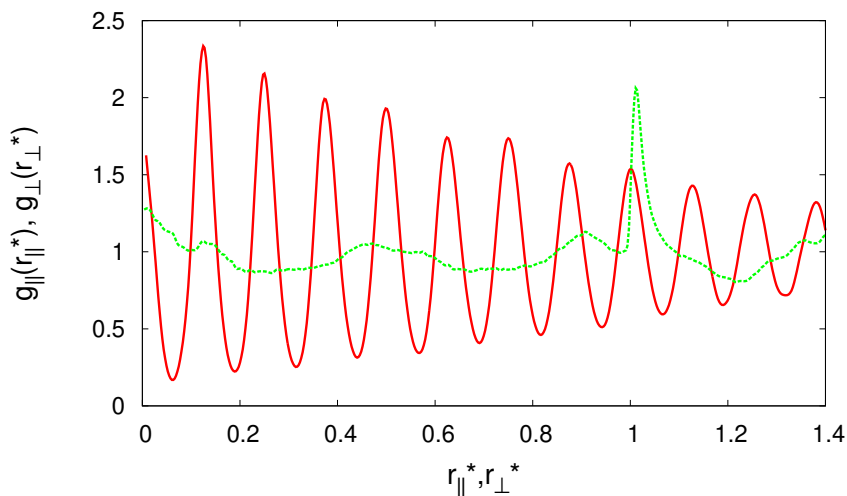


Figure 3.13: Parallel and perpendicular distribution functions of the system for the chosen potential  $U_E$  at  $T^* = 2.5$  and  $P^* = 88$ . Displayed in red solid and green dashed lines respectively.

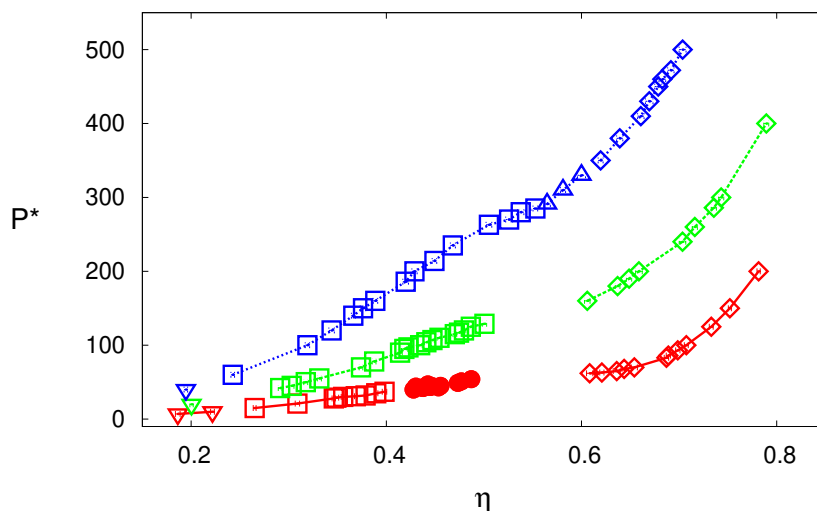


Figure 3.14: Isotherms of the  $U_T$  type potential with parameters,  $\kappa = 0.10$ ,  $\kappa' = 1.90$ ,  $v = -0.40$  and  $\mu = -0.10$ , showing pressure  $P^*$  in reduced units as a function of packing fraction  $\eta$  at temperatures  $T^* = 0.875$ ,  $1.75$  and  $3.50$  in solid (red), dashed (green) and dotted (blue) lines respectively. (error bars within the points size). Where symbols show different phases as,  $\square$  for nematic,  $\nabla$  for isotropic,  $\triangle$  for columnar,  $\diamond$  for tilted and  $\bullet$  for Uniaxial phase.

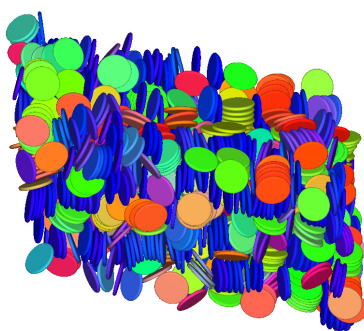


Figure 3.15: Snapshot of a Uniaxial configuration obtained under the chosen potential  $U_T$  at  $T^* = 0.875$  and  $P^* = 43$ , where we can observe how some columnar clusters are trapped oriented in the same direction while others lay in any possible disposition favouring T canonical orientation around them (colours depicting particles orientations).

lacking of columnar phase at medium temperatures. At low temperatures, this drives to the formation of the Cubatic phase, where column chunks of almost cubic proportions are reoriented to minimize the energy of the system (see fig.3.17).

We were able to characterize the Uniaxial and Cubatic phases through the analysis of the orientational distribution function ( $g_2(r)$ ) between the centres of particles. This is plotted in figure 3.18 where we can observe that distinctive features of the parameter appear at a distance of 1 diameter in the Cubatic phase and at a distance of 0.6 for the Uniaxial phase. For the sets of parameters studied, the Cubatic phase has a density of around 6.9+- particles per volume unit, meanwhile the Uniaxial has 6.0+- . This difference in density provides some clues about the behaviour of  $g_2(r^*)$  from  $r^* = 0.5$  to  $r^* = r_c^*$  (cut-off distance of the potential  $r_c^* = 1 + 3a_o$ ), because it means bigger columnar chunks and/or better packaged for the Cubatic phase case. Causing the  $g_2(r)$  to become negative at  $r^* = 1$  due to the big population of particles perpendicularly oriented. One may wonder why the nematic parameter behaves differently in the Uniaxial phase until we understand that their columnar chunks are smaller and/or loosely packaged, causing the

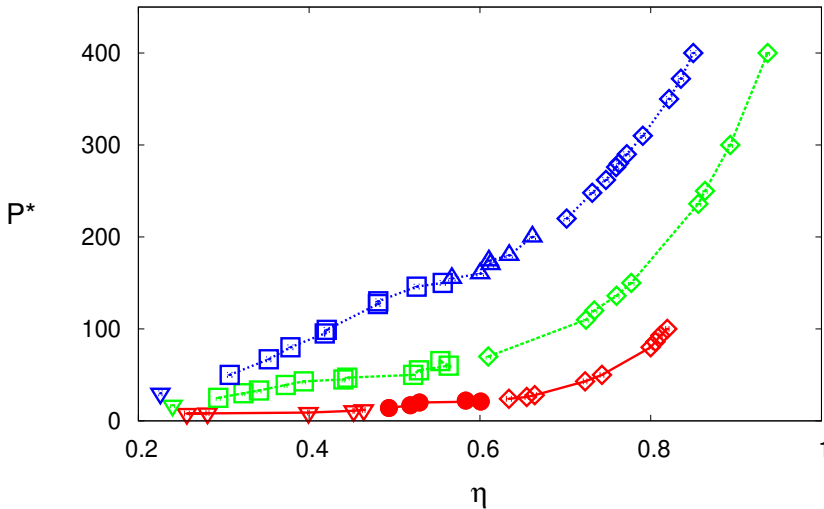


Figure 3.16: Isotherms of the  $U_C$  type potential with parameters,  $\kappa = 0.10$ ,  $\kappa' = 0.10$ ,  $v = -1.30$  and  $\mu = 0.30$ , showing pressure  $P^*$  in reduced units as a function of packing fraction  $\eta$  at temperatures  $T^* = 0.50$ ,  $1.00$  and  $2.00$  in solid (red), dashed (green) and dotted (blue) lines respectively. (error bars within the points size). Where symbols show different phases as,  $\square$  for nematic,  $\nabla$  for isotropic,  $\triangle$  for columnar,  $\diamond$  for tilted and  $\bullet$  for Cubatic phase.

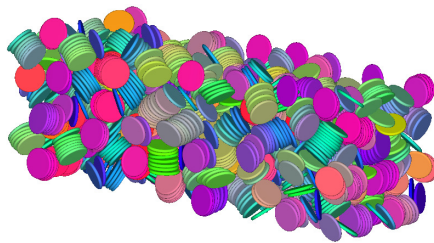


Figure 3.17: Snapshot of a Cubatic configuration obtained under the chosen potential  $U_C$  at  $T^* = 0.5$  and  $P^* = 17$ , where we can observe how columnar clusters of roughly cubic proportions tend to be at positions which maximize the number of particles in C canonical orientation (colours depicting particles orientations).

average population of particles from  $r^* = 0.6$  and further to be randomly oriented. Another reason that supports this is purely geometric since one oblate particle can be interacting with more particles in C than in T configuration.

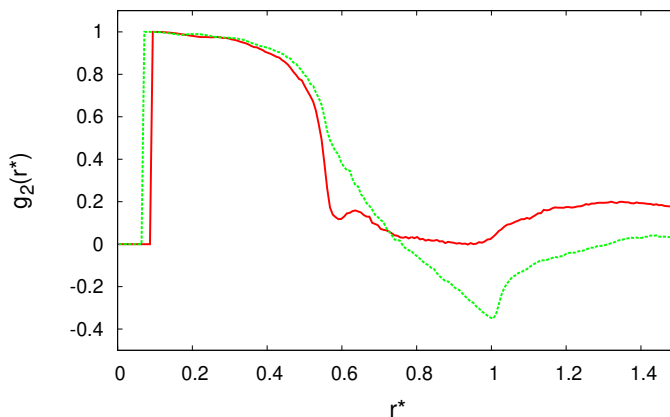


Figure 3.18: Orientational distribution function  $g_2(r^*)$ , represented by a green dashed line for the Cubatic phase and red solid line for the Uniaxial phase. In the chosen potentials  $U_C$  at  $T^* = 0.5$  and  $P^* = 17$  and  $U_T$  at  $T^* = 0.875$  and  $P^* = 43$  respectively.

### 3.5 Conclusions

After a thorough exploration of the space of parameters applicable to the OGBK model, a classification of the main possible outcomes is proposed, regarding the expected self-assembled structures that may arise from the  $U_F$ ,  $U_E$ ,  $U_T$  and  $U_C$  potential types (obviating some intermediate situations). After that, some simulations were performed to test the hypothesized favoured ordering. Finding that, at high temperatures, the phases of hard spherocylinders [53] for the shape anisotropy simulated  $a_o = 0.1$  were found (in increasing packing fraction order; isotropic, nematic, columnar and tilted phase). However, at low temperatures, as soon as the pressure is low enough the minimization of energy takes over reorienting particles into the most stable configurations.

A Discotic-Smectic phase was stabilized for oblates under the  $U_E$  type potential at packing fractions between the columnar phase and the nematic phase. A Cubatic phase was found to be stable under the  $U_C$  type potential between the isotropic and tilted phases, substituting the columnar and nematic ones. And finally, a Uniaxial phase was stabilized for the  $U_T$  type potential substituting, in this case, the columnar phase.

All in all, these results allow us to think that anisotropic interactions in oblate particles can be used to tailor the appearance of new phases with interesting structural features under specific thermodynamic conditions. Likewise, supports the usage of the OGBK potentials to be used as a model for many different types of systems.

## Clusters formation due to directional pair interactions

When a colloidal suspension is cooled, particles can easily be attached to each other by Coulombic or Van der Waals forces. As we will see, depending on how this cooling is performed and some intrinsic characteristics of the system, the attachment can happen on early collisions or delay some time, resulting in a different type of aggregates and subsequent structures. This often means a fall into

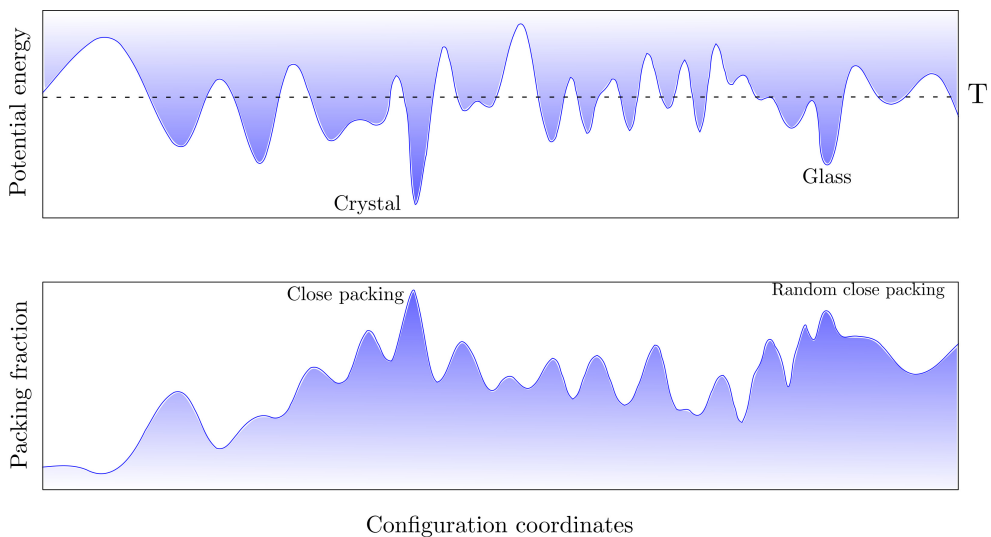


Figure 4.1: Two dimensional projection of an imaginary landscape of configurations.



a glass phase. The glassy behaviour in soft matter has been studied for many decades through theory and experiments, but it is far to be completely understood. Despite the effort of many researchers during this time some phenomena are still elusive to our understanding. This is usually due to the time scales and non-ergodicity of the systems [114, 115]. A lot of effort has been put to ponder the influence of thermodynamic and kinetic factors into the gelation phenomena analysing different scenarios such as, phase separation [116–118], dynamical arrest [119] percolation [114, 117] or even jamming [120]. All this gets even more complex if we try to analyse the interplay of shape, flexibility and interactions of its constituents. These features are easily tunable by present colloidal science opening new and interesting opportunities to research and technological development, attracting more interest every day.

Glasses, even when made of purely passive elements, are in a non-equilibrium state and the transition of a liquid into a glassy state is a fall into a non-ergodic situation, this fact plays an important part in the evolution followed when a liquid is quenched into a glassy state. Usually referred to as "ageing", this process may have many causes and outcomes depending on the system under research [115]. This is mostly due to the different regions of the energy landscapes accessible to every system according to its temperature and previous history. In figure 4.1 we can observe an intuitive representation of that idea, with two-dimensional representations of the energy and packing fraction of an imaginary system as functions of the configuration coordinates. Seeing this we can picture how a system can be trapped into a metastable state depending on the thermodynamic paths available to it, regarding its temperature and initial structure.

This study aims to shed some light on the phenomena of aggregation and subsequent ageing. Therefore, to track the time evolution of some observables, this project will be carried out making use of Brownian Dynamics, performing explorations in density and temperature observing its influence on the different paths and outcomes for several systems.

## 4.1 Methods and tools

This chapter tries to reveal how the directional anisotropy of the interaction potential affects the aggregation dynamics using oblate spherocylinders with the same anisotropy,  $a_o = 0.2$  as defined in section 1.2.1. With this purpose we employ the OGBK potential thoroughly described in chapter 3 with three different sets of parameters. Following the same the notation, one would be F type ( $\kappa = 5$ ,

$\nu = 1, \mu = 1$ ), another E type ( $\kappa = 0.1, \nu = 1, \mu = 1$ ) and the last of Kihara type ( $\kappa = 1, \nu = 0, \mu = 0$ ) where the Gay-Berne factor is reduced to 1, leaving the potential homogeneous. We will refer to them as F, E and K during this chapter for convenience. The dependences of this potential with the minimum distance in the four canonical configurations used as a reference in chapter 2 are plotted for the three potentials in figure 4.2. The reduced units in this study are the same of chapter 2 (See section 2.1).

A tool of choice to simulate colloidal particles is usually Brownian Dynamics (see section 1.2.4). This technique allows applying very simple models and very good characterization techniques, this work is particularly dedicated to investigating, low-density states for three model potentials (F, E and K). To this end, long BD simulations in the NVT ensemble were performed in a density range from 0.01 to 0.5  $\rho^*$  for each potential, at specific temperatures quenching from temperatures of last fluid state found, we refer to it as  $T_f^*$ . To speed up the search of the last fluid point was made monitoring the energy of the systems in MC simulations of a constant number of particles  $N = 1260$  and volume, since in this way the phase space is better sampled. After this first temperature where the system is not exclusively composed of monomers and dimers ( $T_c^*$ ) is located checking the cluster distribution. This distribution is constructed accounting for a connection when two particles are closer than  $d_m = 0.3\sigma$  what coincides with the potential cut-off. Then, the study of dynamic observables was performed at 1.0, 0.95, 0.8 0.5 0.1 times  $T_c^*$  for each density under study. BD simulations were performed quenching from  $T_f^*$ , starting from an equilibrated isotropic configuration of  $N = 1260$  particles. At each temperature structural observables were computed using time intervals in a rather logarithmic scale in  $t^* = t/\tau$ , where  $\tau = \sigma^3 \mu_s / k_B T$ , where  $\mu_s$  is the solvent viscosity and  $\sigma$  is the system's length unit. The time step has been set in the range  $10^{-4} < t/\tau < 2 \cdot 10^{-3}$ . In the following, unless said differently, when two features are showed together, they are compared at the least common maximum time of  $t^* = 815$  in the case of dynamical observables, averaged over 100 independent time origins. Meanwhile, last configurations obtained in each case are displayed the individual maximum  $t^*$  achieved after 6 months of CPU time.

### 4.1.1 Aggregation model

To understand the aggregation process a very simplified model was applied using the above-defined connection criterion. In it every cluster, dimer or monomer count as a single individual, for which the same average aggregation  $k_i$  and dis-

sociation  $k_{-i}$  rate is associated. Therefore, the time evolution of the number of individuals  $N_i$  can be expressed as:

$$\frac{dN_i}{dt} = -k_i N_i^2 + k_{-i} N_i \quad (4.1)$$

At low enough temperatures it is assumed that  $k_i \gg k_{-i}$ , hence given an initial number of particles  $N_0$ , the evolution of the number of individuals over time is approximately described by the following equation:

$$\frac{N_0}{N_i} = N_0 k_i t + 1 \quad (4.2)$$

During the simulations, the cluster formation was monitored with the observable  $\Theta$ , to analyse the aggregation dynamics of the studied states, it was needed an easy to understand or easy to compute magnitude able to indicate the collapse of the system. In their work of 2013 Moggetti et al. [121], find a correlation between intrinsic magnitudes of the systems in his study and the following definition of the degree of clusterization:

$$\Theta = 1 - \frac{\langle N_{clusters} \rangle}{N_{particles}} \quad (4.3)$$

Where  $\langle N_{clusters} \rangle$  is the average number of clusters and  $N_{particles}$  the total number of particles in the system. Thus, when the system is in the dilute gas phase where  $\Theta = 0$  and when all particles belong to the same cluster  $\Theta = 1$ .

The value of  $\Theta$  can be fitted over time with the previous equation taking  $k = N_0 * k_i$  as:

$$\frac{1}{1 - \Theta} = \frac{N_0}{N_i} = kt + 1 \quad (4.4)$$

As an example in figure 4.6 are the values of  $1/1 - \Theta$  as a function of time, and its fits for the temperatures studied at  $\rho = 2$  for the K potential. This can in turn be adjusted in an Arrhenius model like:

$$k = A \cdot \exp\left(\frac{E_a}{\kappa_B T}\right) \quad (4.5)$$

where  $T$  is the temperature,  $E_a$  the activation energy in this model and  $A$  is a constant related to the frequency of collisions in the correct orientation, what in our case would mean for the cases of OGBK model, in E or F configurations for E and F potentials respectively.

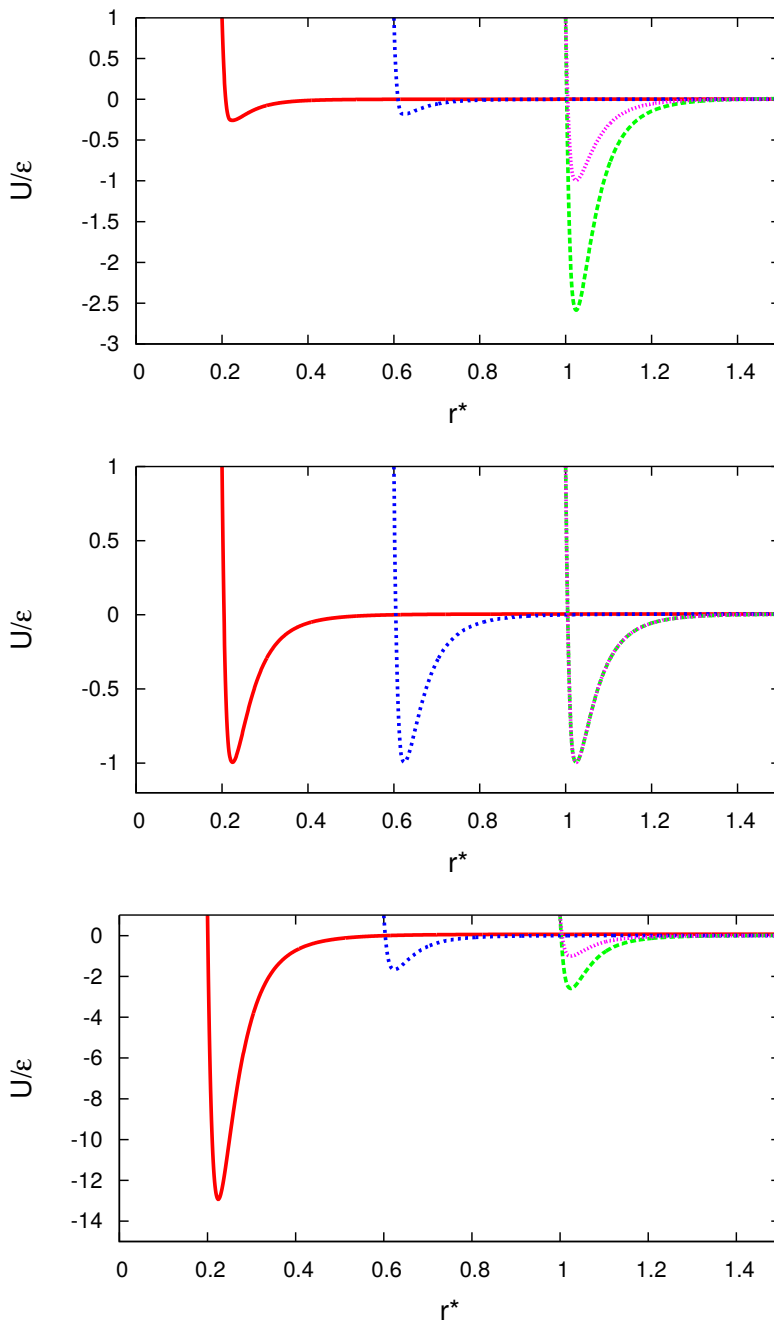


Figure 4.2: Interaction Energy in each of the four canonical configurations for the E, K and F potentials from top to bottom panels respectively. Where configurations F, E, T, C in red solid, green long dashed, blue short dashed and pink dotted lines respectively.

## 4.2 State diagrams

Applying the model described in section 4.1.1, checking the differences in  $E_a$ , we have been able to discern two different regimes of aggregation with similar features for every potential studied. These regions are outlined in state diagrams displayed in figures 4.3, 4.4 and 4.5 for potentials E, F and K respectively. From those, we have to stress that those are not phase diagrams, but rather out-equilibrium maps. In them we can observe at the densities studied the last temperature where the system remains fluid  $T_f$  and below it the first with persistent clusters  $T_c$ . From this point and below, we find the slow aggregation region ( $R_s$ ) where the nucleation events are rather uncommon and the size of clusters appears to be bigger. And finally, below it, the fast aggregation region ( $R_f$ ) with opposite features to  $R_s$ , quickly forming small aggregates that depending on the density of the system can either diffuse, bond or arrest forming a meta-structure. The existence of these two regimes for attractive colloids is known from long

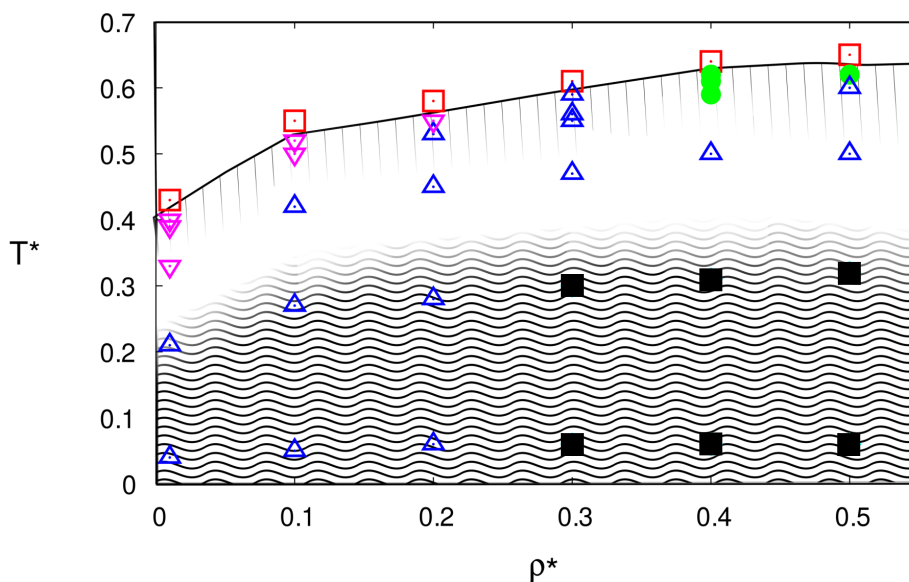


Figure 4.3: Non-equilibrium diagram of the E potential, where, different aggregation regimes are shown with straight ( $R_s$ ) or wavy ( $R_f$ ) lines background. And symbols show different states as,  $\square$  Fluid,  $\bullet$  unique cluster,  $\triangle$  multiple clusters,  $\nabla$  monomers and clusters coexistence,  $\blacksquare$  unique meta structure. More detail in text.

ago [122, 123] traditionally referred to as diffusion limited aggregation (DLA) and reaction-limited aggregation (RLA) [118]. The details on the dynamics of the particles and the structures formed under each potential depict an interesting map of different non-equilibrium states, where we can find a unique or multiple clusters either being the only phase present or in coexistence with monomers, or the very interesting case of a unique meta-structure. In every case with differential characteristics for each potential. When temperatures are close to the fluid region ( $R_s$ ) the collision rates are higher and the size of the clusters formed increases with density. But at low temperatures ( $R_f$ ) the collisions are less frequent but the  $E_a$  increases abruptly, feeding the formation of a bigger number of smaller clusters. The collision rates are also bigger if the system is denser, as the evolution of the constant  $A$  at low temperatures suggests (See fig.4.6). This, in turn, results in the formation of different long-range structures depending on the potential applied as we will see in section 4.4.

The different states found are in concordance with the ones found in experi-

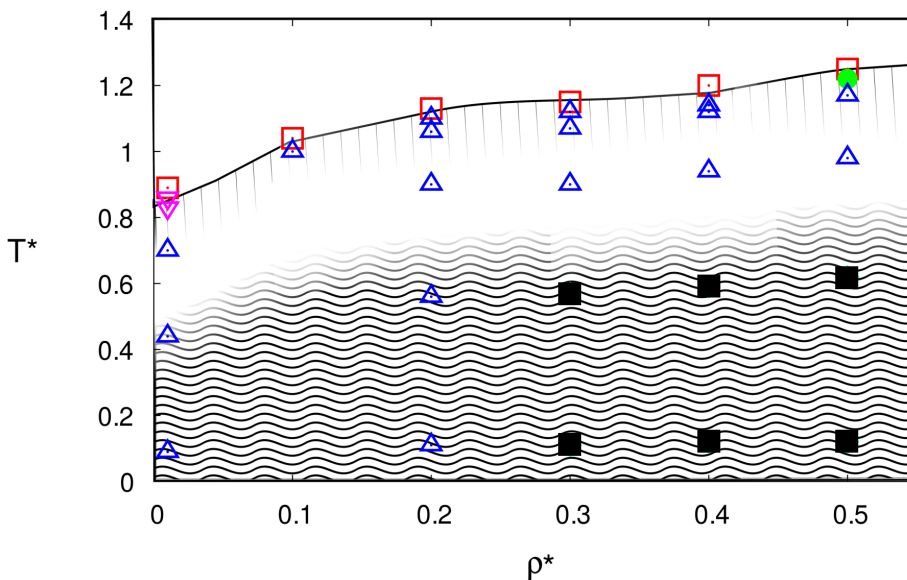


Figure 4.4: Non-equilibrium diagram of the F potential, where, different aggregation regimes are shown with straight ( $R_s$ ) or wavy ( $R_f$ ) lines background. And symbols show different states as,  $\square$  Fluid,  $\bullet$  unique cluster,  $\triangle$  multiple clusters,  $\nabla$  monomers and clusters coexistence,  $\blacksquare$  unique meta structure. More detail in text.

ments of attractive glasses and gels [115, 124], as will be later discussed, leaving aside the peculiarities of the potential implemented. One small caveat worth to mention is that these simulations have no gravity field applied, and this may explain why we do have coexistence instead of phase separation of colloids and aggregates [117].

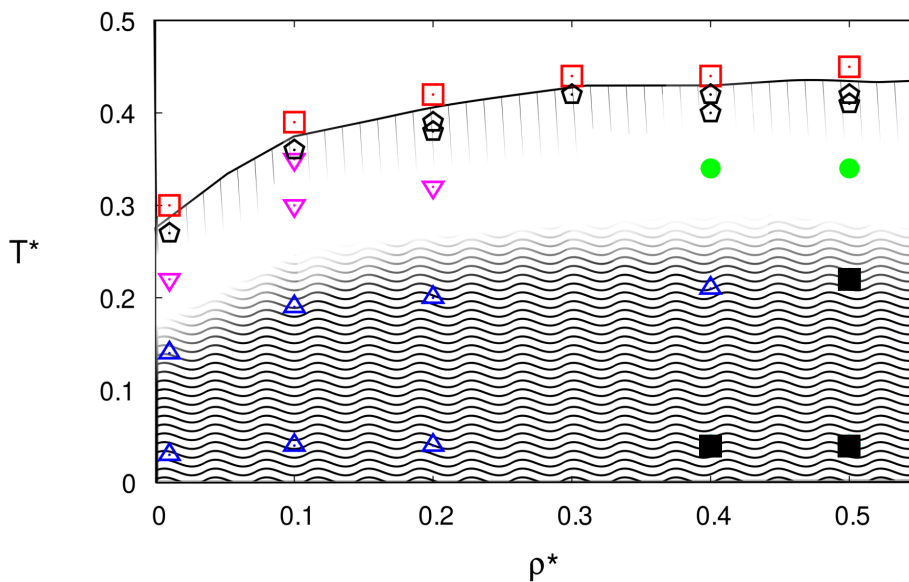


Figure 4.5: Non-equilibrium diagram of the E potential, where, different aggregation regimes are shown with straight ( $R_s$ ) or wavy ( $R_f$ ) lines background. And symbols show different states as,  $\square$  Fluid,  $\bullet$  unique cluster,  $\triangle$  multiple clusters,  $\nabla$  monomers and clusters coexistence,  $\diamond$  transient clusters,  $\blacksquare$  unique meta structure. More detail in text.

### 4.3 The aggregation model at work

The fitting of  $k$  at temperatures close to the fluid region can be misleading due to its steepness in the early stages of the cluster formation, as can be seen in figure 4.6 where for each temperature the evolution of the number of clusters is fitted to  $k$  as defined in section 4.1.1. This leads to big uncertainties displayed in some points with big error bars in figure 4.7 where the  $k$  fitted for each point is plotted using  $\ln(k)$  as a function of  $1/T^*$ , to obtain the  $E_a$  in each range of temperatures. However, in general, this simplified aggregation model seems good enough to obtain very relevant information from the systems.

In figure 4.7 can be observed two different aggregation regimes for every studied density of the K potential, characterized by an abrupt change in  $E_a$ . This featured is observed in the same fashion for the cases of potentials E and F, but given the small number of sampled temperatures in each case, neither the  $E_a$  nor the exact temperature for the regime transition could be precisely determined.

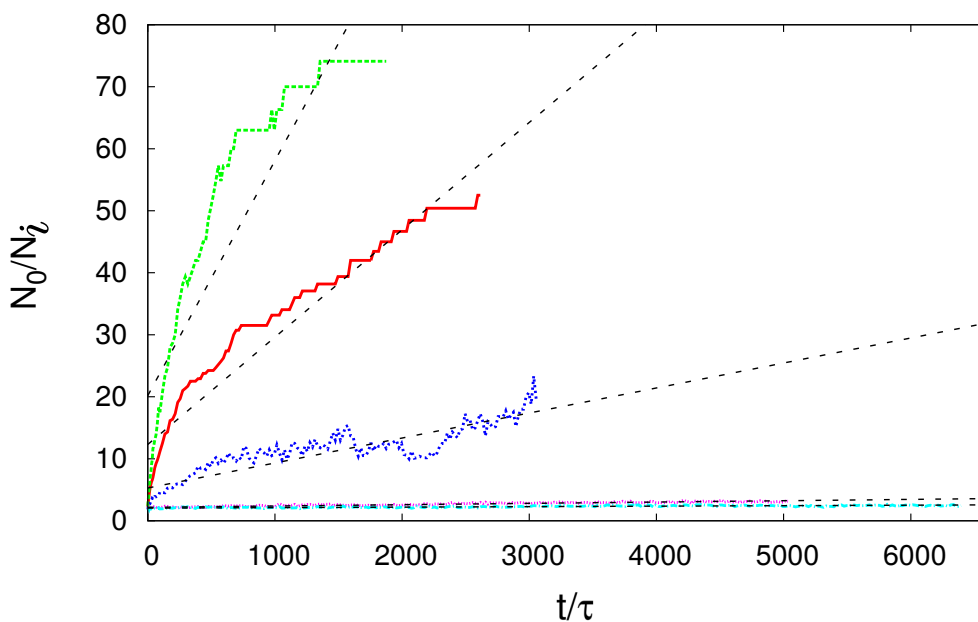


Figure 4.6: Fitting of the aggregation rate constant  $k$  at density  $\rho^* = 0.2$  for the K potential at temperatures  $T^*/T_c^* = 0.1, 0.5, 0.8, 0.95$  and  $1.0$ , in red solid, green long dashed, blue short dashed, pink dotted and cyan dashed dotted lines respectively. With the nearest black long dashed spaced line near to them being their fitted line.



Nevertheless, in figures 4.3, 4.4, 4.5, this two regions of the state diagrams are marked using different backgrounds. In the case of the  $E_a$ , it is to be remarked a difference of roughly two orders of magnitude between the value it takes in each regime.

Meanwhile, at low temperature (figure 4.7) is enough to argue that collisions in the correct orientation increases at higher densities since the constant  $A$  does the same (See eq. (4.5)). The behaviour of the aggregation rates at different densities can be clarified at temperatures close to the fluid region. With this purpose, we track in time, the evolution of populations of monomers, dimers and bigger clusters separately. In figure 4.8 we can observe precisely this for each potential comparing  $\rho^* = 0.1$  and  $\rho^* = 0.5$  at the temperatures studied just below the fluid region. If particles find each other at distances shorter than the cut-off of the potential, their interaction may result in aggregation with high probability if they find each other in a convenient orientation. Oblate particles they have more probability to collide with a rather parallel revolution axis since these covers

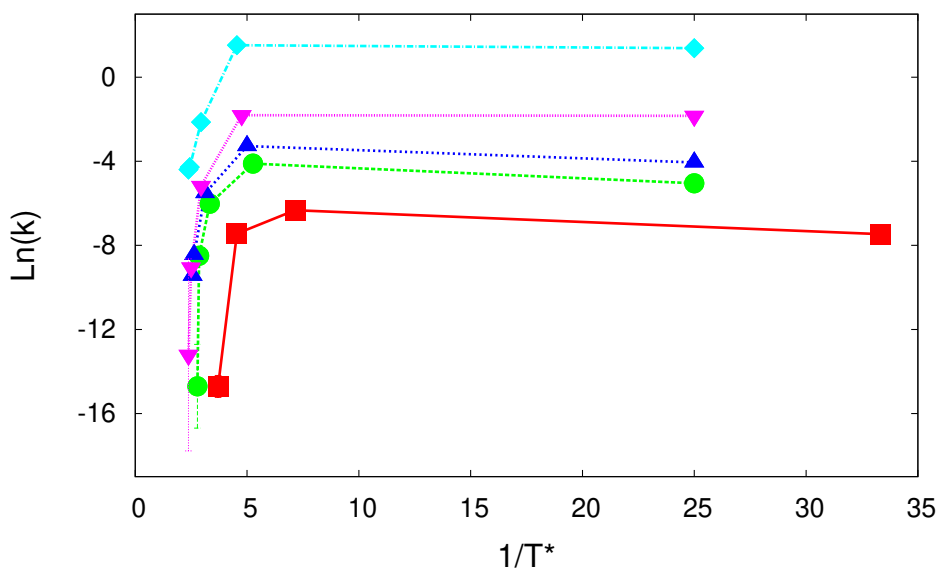


Figure 4.7: Plot of  $\ln(k)$  vs  $(1/T^*)$  for the K potential at densities  $\rho^* = 0.01, 0.1, 0.2, 0.4$  and  $0.5$  in red solid, green long dashed, blue short dashed, pink dotted and cyan dashed dotted lines respectively. Where symbol are simulated temperatures and any plausible straight line drawn would have  $E_a$  as slope and  $A$  as cut with the Y-axis.

more solid angle. To these conditions we should add that depletion interactions [125–127] would favour the F orientation even if the potential is homogeneous in all orientations as the K is. This feature can be either promoted if we are modelling particles with the F potential as we saw in chapter 3, or in the case of the E potential weakened.

The described behaviour has profound repercussions from the early stages of the quenching applied, even with this little change in temperature. As we can see in figure 4.8, almost instantly nearly 20% of the system form dimers at low densities and stays rather stable but at low densities rapidly decrease in favour of bigger clusters, except in the case of the E potential where that seems to take longer. At density,  $\rho^* = 0.5$  cluster fraction quickly overcomes dimers and monomers for the three potentials. As we will see in section 4.4 the configuration obtained at the maximum simulated time, both E and T potential arrive at a single cluster with very defined short-range structure meanwhile the K potential keeps a population of dimers and monomers. We can assume as a rule of thumb, that the F potential will always accelerate the formation of clusters meanwhile the E potential slows it down respect to the K potential. One may conclude that the K potential form clusters which loose and gain particles at high rates, so it is rather a fluid of transient clusters [115]

The dynamical information obtained at time  $t^* = 815$ , would be incomplete not knowing where do the states come from, to this end was computed the value of  $\Theta$  along the simulations to easily show the cluster proportion of the system. Observing figure 4.10 we can see that at high density  $\rho^* = 0.4$  when  $\Theta$  is first computed at  $t = 1$  it shows values over 0.5 in all cases indicating an abrupt aggregation between the closest neighbours since the beginning. This behaviour becomes less significant at lower densities where the closest neighbours are further.

To compare the evolution of  $\Theta$  in the different regimes, figure 4.10 shows it at temperatures  $T^*/T_c^* = 0.1$  and  $0.95$ . If we focus on the low temperature ( $R_f$ ) the number of clusters is quickly reduced, a feature which is fuelled at high densities by clusters closeness. In this sense, as we will see, the compactness of the clusters depends on the potential under study (increasing in order  $E \rightarrow K \rightarrow F$  in our case). What is coherent with the delayed aggregation of the formed clusters. If we now pay attention the evolution of  $\Theta$  which for the high temperature ( $R_s$ ), displays faster aggregation in the also in increasing order  $E \rightarrow K \rightarrow F$  as was supposed during the application of the aggregation model. The behaviour of  $\Theta$  under the K potential in  $R_s$  is also coherent other results, that as we will see indicate a stable state where particles easily go in and out of big clusters.

### 4.3.1 Dynamics

The observables showed in this section were computed as averages over all particles, so we should take into account that the number and size of clusters and

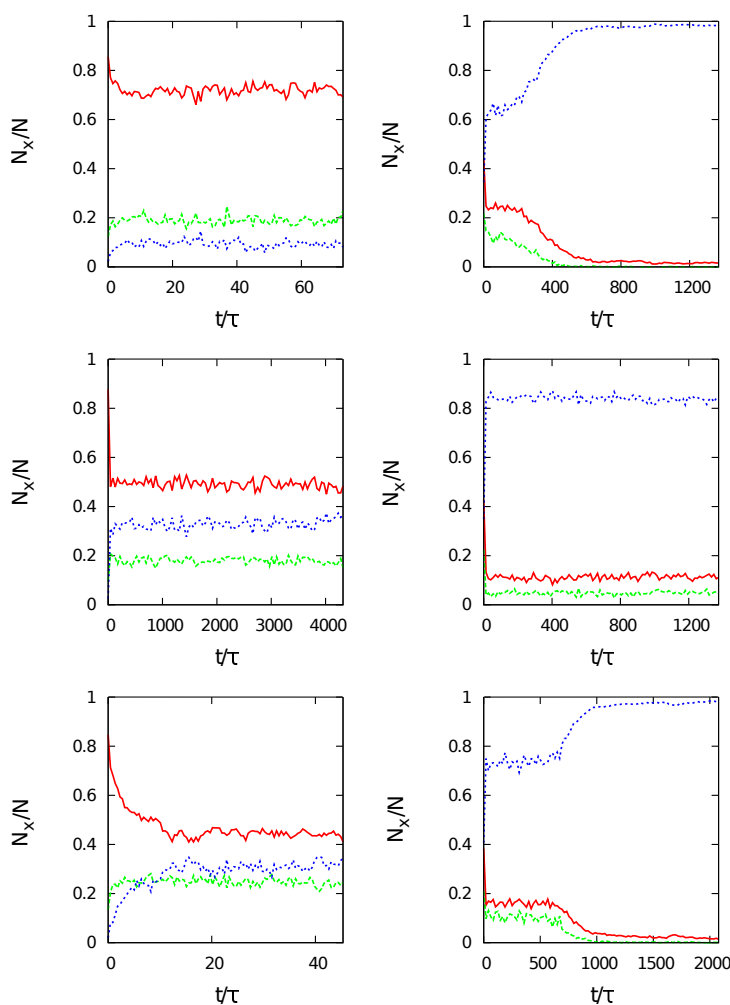


Figure 4.8: Fractions of the total number of particles ( $N$ ) which are monomers (red solid line), dimers (green long dashed line) and clusters of three or more particles (blue short dashed line) in the early stages of aggregation. Shown at  $\rho^* = 0.1$  and  $\rho^* = 0.5$  on left and right panels respectively for potentials E, K and F from top to bottom panels respectively at temperatures just below the fluid region (see figures 4.3, 4.5 and 4.4).

the particles that do not belong to any cluster can influence these calculations. Even if we are studying non-equilibrium systems, we expect to have a very stable situation after this long simulations, indeed there is no sign of abrupt transition in any case at  $t^* = 815$ . The most relevant result from the observations of the dynamics is that at temperatures just below  $T_f$ , the K potential still resembles a fluid when even the majority of the particles of the system form a cluster meanwhile in the E and F potentials, particles show a subdiffusion typical of a gel [128], as can be seen in figure 4.9. This distinctive state is marked on figure 4.5 with black pentagons.

For the K potential at  $\rho^* = 0.4$ , and in the same range of temperatures, the information obtained from the mean squared displacements (fig. 4.12) and from the self scattering function (*ISF*) in figure 4.11, are the two sides of the same coin which corroborates the differences between the two regimes. This to figures serve as an example of the common behaviour of the three potentials, featured by the existence of two different relaxation times, and a transition from a fluid to a very subdiffusive regime as the temperature is reduced. The  $\chi_4(t)$  was also used to try to disentangle how the aggregates of each potential are reflected on the

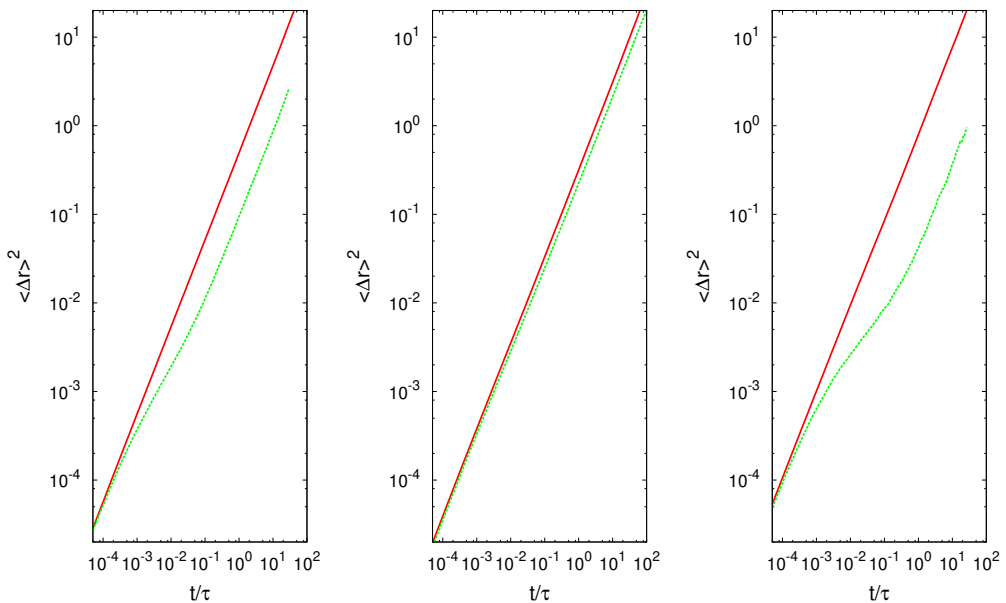


Figure 4.9: Mean squared displacement at  $\rho^* = 0.4$  at  $T_f$  and  $T_c$ , in red solid and green long dashed lines respectively, for potentials E, K and F from left to right panels respectively.

collective behaviours of the system, but unluckily this task seems to need more extensive simulations to decorrelate the effect of thermal history and the different orientations of the potentials, and the  $\chi_4(t)$  is not shown here.

### 4.3.2 Structural Information

From chapter 3 we know that E and F potentials tend to form specific structures at low enough temperatures. To investigate the possible manifestations of this in the final states the radial distribution function is used inspect the clusters in the search for this kind of internal ordering because this should leave a characteristic signature in it. To show, this  $g(r)$  are plotted at different temperatures for an intermediate density of  $\rho^* = 0.2$  in figure 4.13, for the E, F and F potentials.

The E and the F potential both show many peaks at distances bigger than  $r^* = 0.1$ , in the case of the E potential the peaks are signaling a layered structure meanwhile the peaks of the F seem to be signaling a columnar structure. In both cases, the structures at distances bigger than  $r^* = 0.1$  obtain preponderance as the temperature increases, which indicates bigger clusters. Is also remarkable how the peak at  $r^* = 0.1$  for the F and the peak at  $r^* = 0.1$  for E potentials are present with similar intensities at all temperatures indicating that even a heavy quench is not able to trap particles in rather random orientations.

For the Kihara potential, we find a peak at low temperatures around 0.2 indicating that particles are attached in an F configuration and another peak at  $r^* = 1.0$  indicating an E configuration. As the temperature increases, these two peaks disappear indicating more randomly oriented configurations in more open structures.

In general, if we observe the evolution of the structures with temperatures they seem coherent with a transition from DLCA to RLCA due to the range of the structures formed [129, 130].

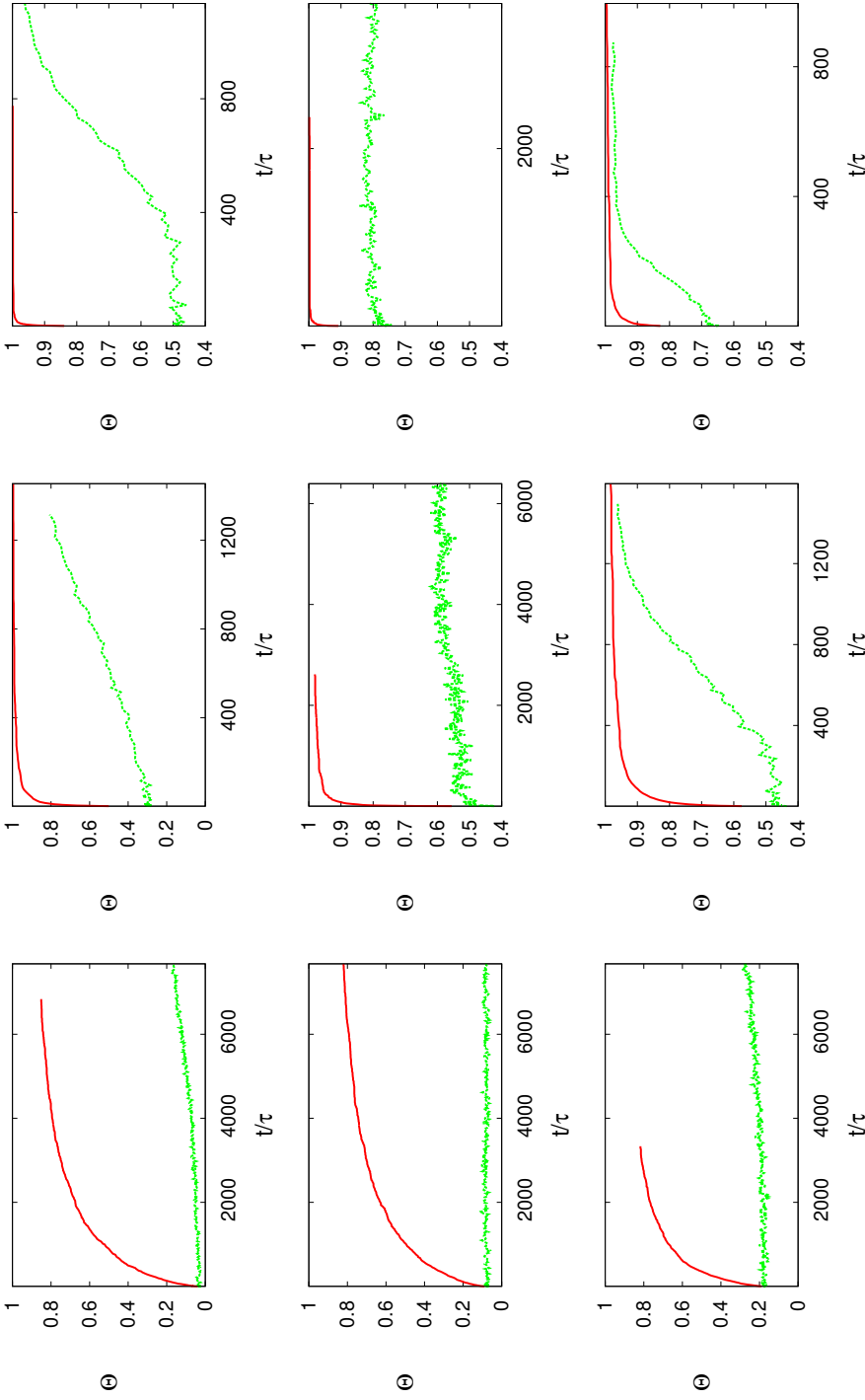


Figure 4.10:  $\Theta$  of the systems over time, at densities  $\rho^* = 0.01, 0.2$  and  $0.4$  from left to right panels for potentials E, K and F from top to bottom panels respectively. At temperatures of  $T^*/T_c^* = 0.1$  and  $0.95$  in red solid and green long dashed lines respectively (directions referenced from text orientation).

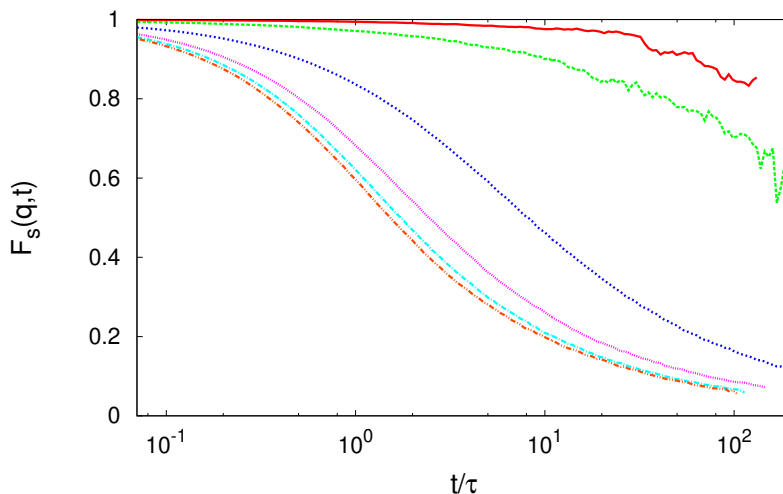


Figure 4.11: The self part of the intermediate scattering function (s-ISF) in the K potential at  $\rho^* = 0.4$  and temperatures  $T^*/T_c^* = 0.1, 0.5, 0.8, 0.95$  and  $T_f$  in red solid, green long dashed, blue short dashed, pink dotted, cyan dashed dotted and orange long dashed double dotted lines respectively.

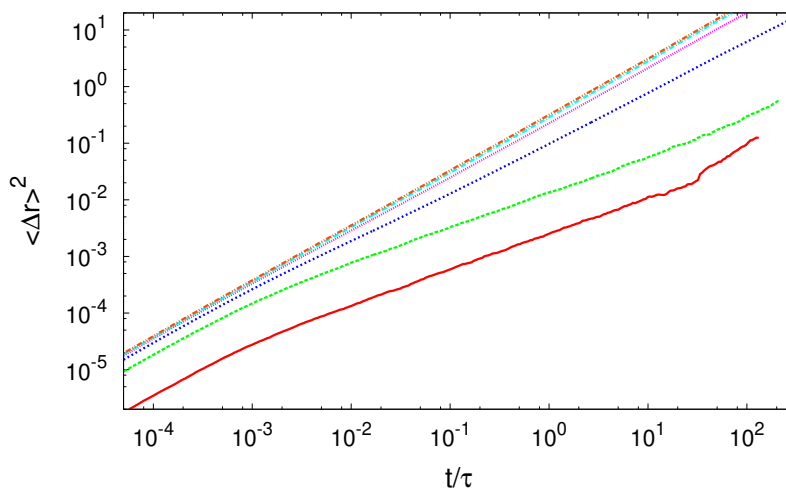


Figure 4.12: Mean squared displacements in the K potential at  $\rho^* = 0.4$  and temperatures  $T^*/T_c^* = 0.1, 0.5, 0.8, 0.95$  and  $T_f$  in red solid, green long dashed, blue short dashed, pink dotted, cyan dashed dotted and orange long dashed double dotted lines respectively.

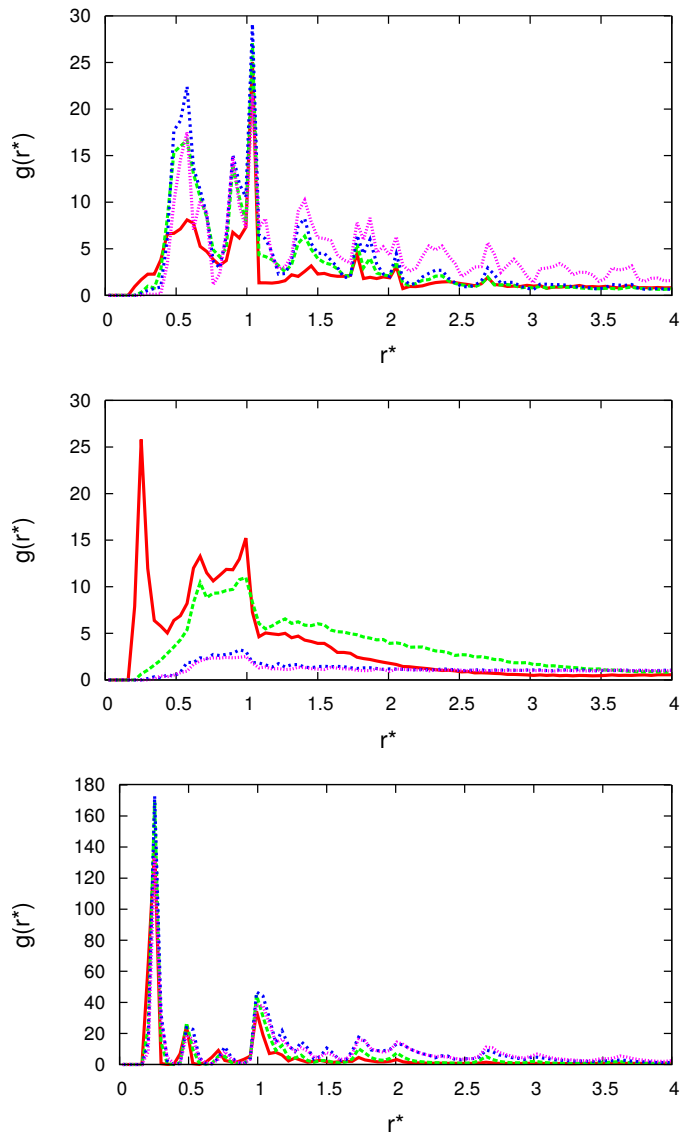


Figure 4.13: Radial distribution functions at  $\rho^* = 0.2$  for the E, K and F potentials from top to bottom panels respectively. Displaying temperatures of  $T^*/T_c^* = 0.1$ , 0.5, 0.95 and 1 in red solid, green long dashed, blue short dashed and pink dotted lines respectively.



## 4.4 Configurations

In figures 4.14, 4.15 and 4.16 we can observe snapshots of the last states achieved at the points marked with symbols in the state diagrams of potentials E, F and K (Figs. 4.3, 4.5, 4.4 respectively). In them, we can visually inspect the final structures after long aggregation processes and check that configurations observed are coherent with the obtained results. Even if the shape and internal ordering of the aggregates are different, the states with similar features are named the same. However, we can observe that the F potential tends to form highly compact clusters since, as we can see they are composed of columns. The E potential form lenticular clusters due to its tendency to align particles facing edges. And in the case of the K potential, the clusters lack any internal producing rather spheric clusters.

It would be interesting to perform a more detailed study on the differences between the transitions from DLCA to RLCA [131] for the different potentials and densities since we observe that at very low densities  $\rho^* = 0.01$  there is a transition between similar states (coexistence of monomers and clusters and an apparent fluid of clusters) for the three potentials, but in denser systems the interactions start to play their part shaping clusters and meta-structures.

Snapshots from the states at the two higher temperatures from density  $\rho^* = 0.1$  upwards, for the K potential, displayed a state that to our analysis is indistinguishable from vapour-liquid coexistence [132, 133]. However, for equivalent temperatures in the E and F potentials, it is showing a few clusters, without coexistence with monomers. These snapshots can be compared with asymptotic evolution of  $\Theta$  for these temperatures in figure 4.10 and make us assume that any monomer displayed in the pictures in the cases of E and F potentials will become part of a cluster rather than coexist with them.

The multiple clusters regions showed in the snapshots for the three potentials manifest different dynamic, structural and kinetic features, but even if they may look like a fluid of clusters, further investigation would be necessary to label them as it [134].

At temperatures  $T^*/T_c^* = 0.80$  and below in all systems clusters seem to either aggregate or become arrested, therefore its size and shape play a decisive role in the structures found. It seems that the compactness of the columnar clusters formed in the F potential help to form more open structures, meanwhile flat clusters of the F potential tend to align more reducing the space between them.

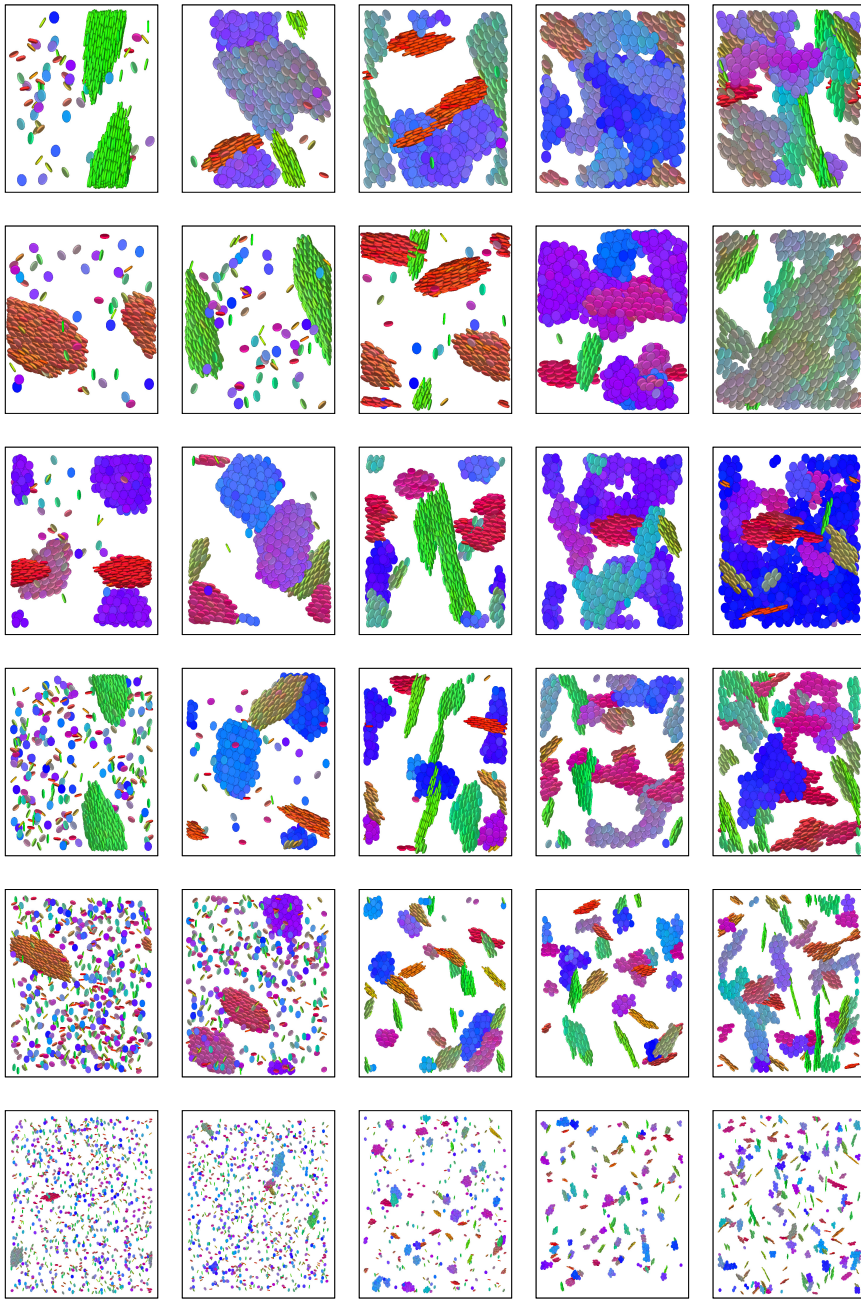


Figure 4.14: Snapshots of the final configurations obtained for the E potential at relevant states. From left to right, densities  $\rho^* = 0.01, 0.1, 0.2, 0.4$  and  $0.5$  from top to bottom temperatures  $T^*/T_c^* = 1, 0.95, 0.8, 0.5, 0.1$  (directions referred from text orientation, and (colours depicting particles orientations)

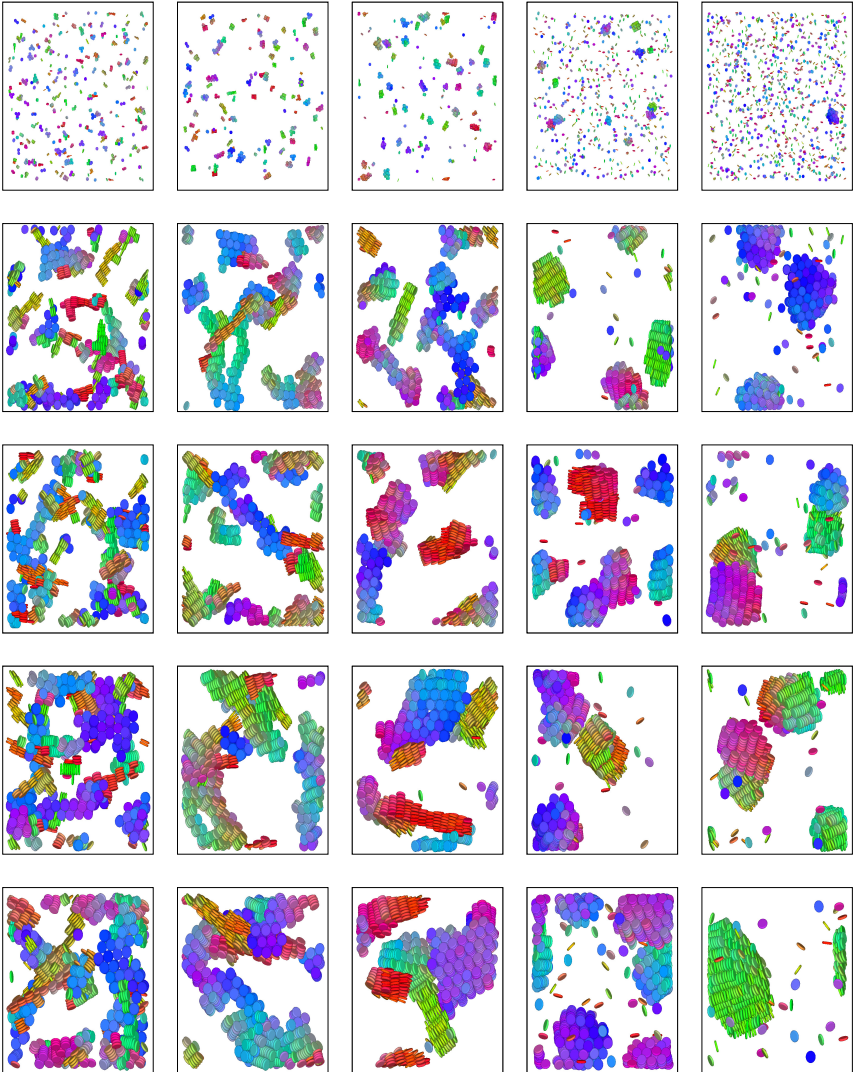


Figure 4.15: Snapshots of the final configurations obtained for the E potential at relevant states. From left to right, densities  $\rho^* = 0.01, 0.2, 0.3, 0.4$  and  $0.5$  from top to bottom temperatures  $T^*/T_c^* = 1, 0.95, 0.8, 0.5, 0.1$  (directions referenced from text orientation, and colours depicting particle orientations).

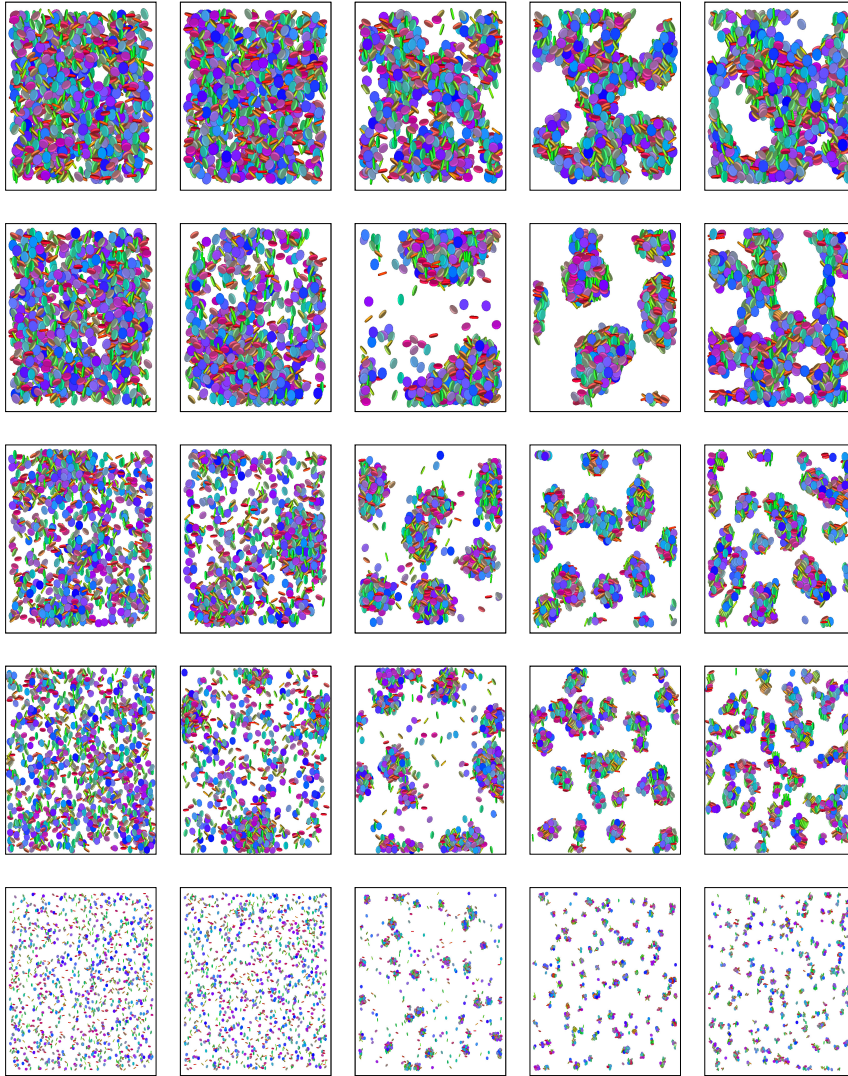


Figure 4.16: Snapshots of the final configurations obtained for the K potential at relevant states. From left to right, densities  $\rho^* = 0.01, 0.2, 0.4$  and  $0.5$  from top to bottom temperatures  $T^*/T_c^* = 1, 0.95, 0.8, 0.5$  and  $0.1$  (directions referenced from text orientation, and colours depicting particle orientations)

## 4.5 Conclusions

In this work, we compare three different potentials E, F and K, in the context of colloidal suspensions to gain some insight into the role played by anisotropic interaction potentials. In this chapter are investigated a rather wide range of densities, making in quenches at significant temperatures. On the one hand this number of variables broadly explored, there can be found many similar features, as are the two regimes of aggregation,  $R_s$  where big clusters are slowly formed in cases of high densities easily integrating all particles in the system and  $R_f$  where small clusters are quickly formed and at high enough densities depending on the characteristic structure of the aggregates reaching percolation. Leaving aside the shape of the clusters, the estates found at  $\rho^* = 0.01$  were qualitatively the same due to the low rate of collisions. On the other hand, the Arrhenius type aggregation model showed a direct correlation of the collision rate with the density, which would yield in a more effective aggregation in the case of the F potential than in the K, or less effective than the K for the E potential.

The radial distribution functions are indubitable proof that anisotropic interactions control the internal structure and shape of the clusters, forming almost lenticular aggregates in the case of the E potential, columnar aggregates in the F potential and randomly oriented ones in the case of the K potential. However, its size and possible meta-structures seem to rely on the thermodynamic history, especially we could check that deeper quenches yield smaller clusters.

The K potential showed a different behaviour just below the fluid region, compared to the E and F types, where the monomers tend to disappear. The K potential seems to achieve coexistence of monomers and a unique cluster, to which the reversibly attach and detach, further research is needed to conclude if it is a vapour liquid coexistence [132, 133].

## Coarse grain model of a clay

Clays are present in many common products as paper, synthetic plastics or adhesives. Their applications are vast in number [135], from industrial drilling or surface coatings to drug delivery [136, 137]. Among them, the most common use is to control the rheological properties of consumer products, due to its rich behaviour in water and other fluids suspensions. This study is focused on the specific case of laponite [138], which is usually modelled as a thin disk of  $1\text{nm}$  of height and  $25\text{nm}$  of diameter, with its rim positively charged and its faces negatively charged (See figure 5.1). In laponite suspensions, the salt concentration is used to control the formation of different phases, modulating the effective charge [139] as DLVO theory [140, 141] predicts. The variance of the effective

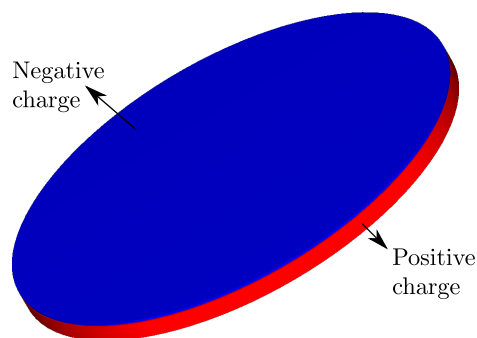


Figure 5.1: Laponite modelled as a cylinder of  $1\text{nm}$  of height and  $25\text{nm}$  of diameter, with its rim positively charged and its faces negatively charged

relative face to rim charge ratios is key to understand the formation of the different phases this substance can show [142], such as gels, repulsive and attractive glasses or Wigner glasses. The competition between short-range attraction and long-range repulsion has motivated several studies investigating how the charges in laponite surfaces affect its aggregation and phase behaviour [143–145], but it is now clear that it is the patchy attractive interactions, what controls the phase behaviour and the long-term stability of the system [142].

To perform full atomistic MD simulations large enough in time and number of particles, to observe interesting results of multi-aggregate systems is out of reach for presently available computational facilities, therefore a coarse grain approach is needed. The attempt of Dijkstra *et al.* [100] to model laponite as an infinitely thin disk with a quadrupole charge was enough to obtain the nanoporous structure known as "house of cards", and recently beads models [146, 147] have been successful in this aspect, arranging different charged spheres forming a flat disk shape. These models are easier to implement than effective pair interaction potentials but more computationally expensive. Thus motivating the use of potentials like the Gay-Berne, as in these works of Ebrahimi *et al.* [148, 149] to fit it to atomistic simulations data. In this chapter the OGBK model explored in chapter 3 is extended to a laponite model, fitting its parameters to mimic the interactions that arise in this clay. With a functional form similar to others obtained with different approaches [150].

## 5.1 OGBK adapted to a clay

After a shallow observation of the interaction of Laponites, the attraction in a T configuration seems one of the most relevant features. This behaviour as we saw in chapter 3 can be achieved through many combinations of parameters of the OGBK model that satisfy the condition of having the global minimum in a "T" configuration.

In a first naive approach one can take the aspect ratio given by the manufacturer of this synthetic clays which is  $L/D = 0.0368$  and look for a combination of parameters that has the global minimum in a T resulting E, F and C configurations much less attractive. This choice have a few caveats, the first one is that we can not avoid having a C configuration to be attractive and the second is inherent to the OGBK formulation since the set of parameters that allow for the T configuration to be the more attractive also implies the E to be less repulsive than the C which is rather unphysical. Therefore, to avoid this, the model was reformulated

into a soft repulsive potential plus an attractive patchy for the "T" configuration. All this is modulated by the Gay-Berne factor, keeping the Kihara approach to oblate particles. To explain it in a simpler manner, the previous Kihara formulation was separated into repulsive and attractive terms and the latter multiplied by Gaussian function with angular dependence in a similar approach to the ones of previous patchy models [151, 152]. If we take the revolution axis of two oblates

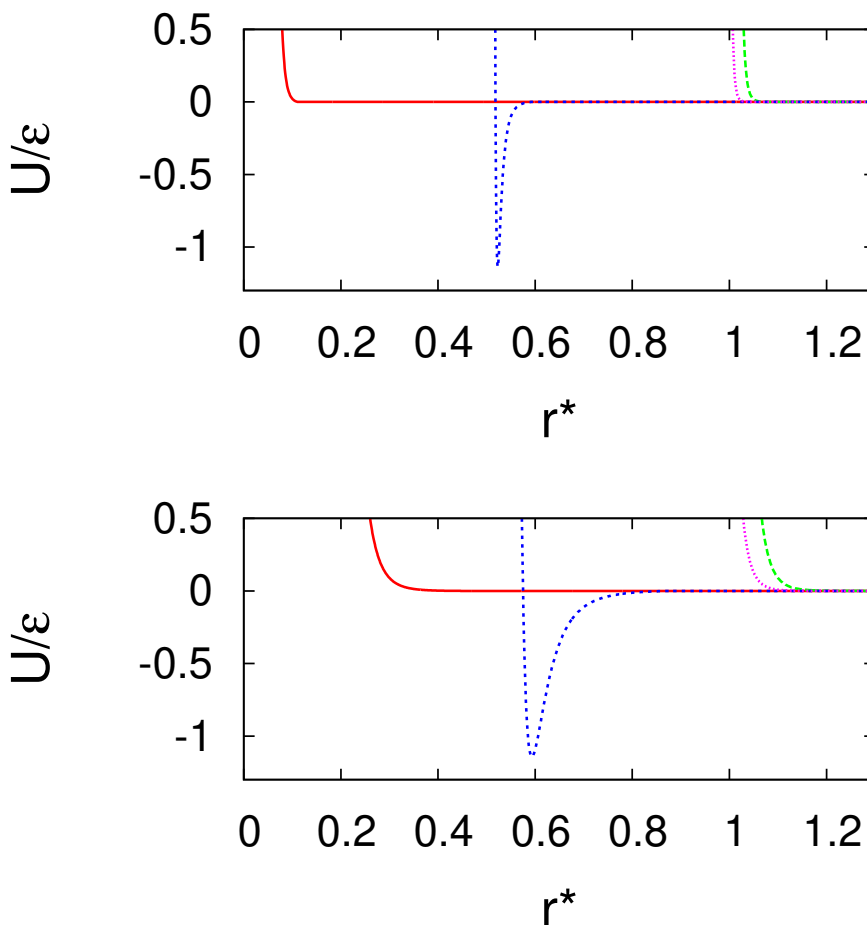


Figure 5.2: Patched type potential with parameters, ( $\kappa = 9$ ), ( $\nu = 1.9$ ), ( $\mu = 0.2$ ) with shape anisotropy  $a_o = 0.0368$  and  $a_o = 0.15$  in top and bottom panels respectively. The configurations F, E, T, C in red solid, green long dashed, blue short dashed and pink dotted lines respectively.



$\mathbf{u}_i, \mathbf{u}_j$  and the normalized vector pointing from one centre to the other  $\mathbf{r}$  due to particle symmetry, allows us to calculate the angles they form without any loss of information and operate with them in the following way:

$$\begin{aligned} a_{ij} &= \arccos(\mathbf{u}_i \mathbf{u}_j) - \pi/2 \\ a_{ir,jr} &= \arccos(|\mathbf{u}_i \mathbf{r}|) + \arccos(|\mathbf{u}_j \mathbf{r}|) - \pi/2 \end{aligned} \quad (5.1)$$

Those angles are used as arguments for a Gaussian function, which takes values of one for "T" configurations and zero for any other:

$$P(a_{ij}, a_{ir,jr}) = \frac{[\exp(-\frac{a_{ij}^2}{\sigma_p}) - W] \cdot [\exp(-\frac{a_{ir,jr}^2}{\sigma_p}) - W]}{[1 - W]^2} \quad (5.2)$$

Where  $W = \exp(-[\pi/2]^2/\sigma_p)$  plays the role of a normalization constant and  $\sigma_p$  gives us a measure of the angular width of the patch. For our purpose, it

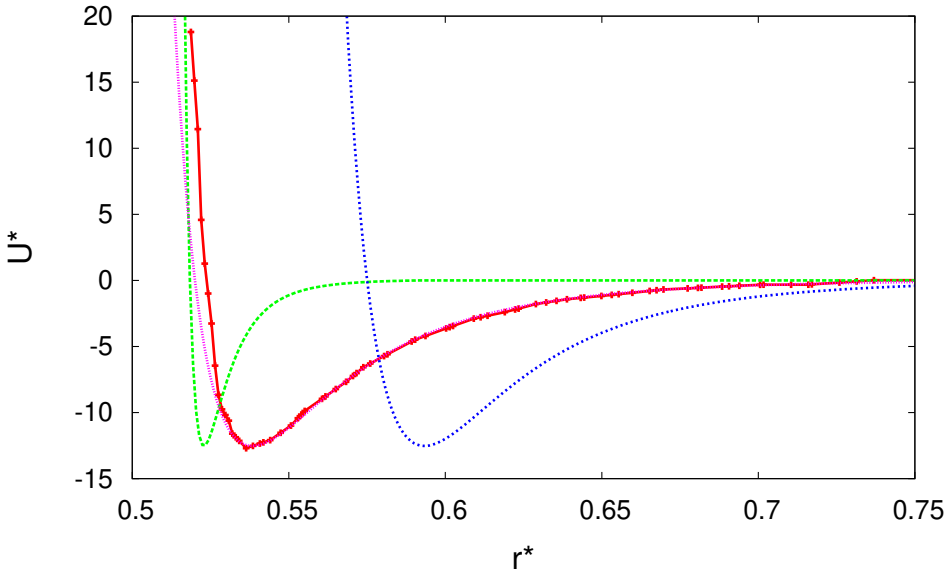


Figure 5.3: Detail of potential energy ( $U^* = 10.96331 \times U/\epsilon$ ) in the T configuration for the P potential for oblates of  $a_o = 0.0368$  in green long dashed line, of  $a_o = 0.15$  in blue short dashed line and this same curve displaced  $-(0.15 - 0.0368)/2$  in pink dotted line. Red solid line are simulation results from [150].

was related to the aspect ratio of the oblates particles (see section 1.2.1) in the following way:

$$\sigma_P = 2 \left[ \arctan \left( \frac{\sigma}{L} \right) \right]^2 \quad (5.3)$$

Now the final expression for the potential is:

$$E_{OGBK} = \varepsilon_{GB} \left[ \left( \left( \frac{\sigma}{d_m} \right)^{12} - \left( \frac{\sigma}{d_c} \right)^{12} \right) - \left( \left( \frac{\sigma}{d_m} \right)^6 - \left( \frac{\sigma}{d_c} \right)^6 \right) \cdot P(a_{ij}, a_{ir, jr}) \right] \quad (5.4)$$

This is modulated as before by the Gay-Berne factor resulting in an oblate Gay-Berne Patched Kihara (OGBK) potential. And finally, it is truncated and shifted at  $d_c$  (cut-off distance) to make it continuous.

Now we are ready to set the parameters needed to provide the desired relative anisotropic interactions. To do, so we pick now the set of parameters  $\kappa = 9$ ,  $\nu = 1.9$  and  $\mu = 0.2$ , selected after filtering the data obtained from a similar exploration of parameters in the same ranges as the one performed in section 3.1, to meet the needs of this study. This set of parameters produce what we will call from now on P potential, which provides a ratio of  $-1.15$  (negative sign due to opposite sign of energy) between the energy in F configuration at distance  $r^* = 0.24$  (positive) and the minimum energy in the T configuration at  $a_o = 0.15$  (negative). Which is as close as we can get to the given by Odriozola *et al.* [150]  $-1.23$  for an average superficial charge. After that, we only need to scale the temperatures to have a "T" configuration well of identical depth to anyone we desire. Meanwhile, other angular configurations are now repulsive and therefore at least qualitatively similar to laponite. But even after temperature scaling the potential shape are far from previous models accounting for interactions with ionized media (See fig.5.3). In those models [150, 153] repulsions appear to be softer and attractions, resulting in wider potential wells. In the OGBK model this is controlled by the aspect ratio, therefore to obtain functional shapes similar to previous models, we need to simply increase the anisotropy up to  $a_o = 0.15$ . A comparison of the same potential for the two anisotropies is displayed in figure 5.2, where we can see the potential energy as a function of the separation of the particles in the four canonical orientations, in it we can observe that repulsions also become softer. This motivates us to pick this anisotropy to run the simulations of the study.

To compare the data from Odriozola *et al.* [150] to the shape of the P potential we plotted figure 5.3 where we can observe that the increase in aspect ratio also displaces the location of the minimum. Nevertheless, if we displace the curve back exactly half the difference of the aspect ratios  $((0.15 - 0.0368)/2)$  we observe a good overlap of simulation data and our functional form. Being this just a graphical check, not implying that the potential used in our simulations is corrected in that way.

## 5.2 Simulations details

Simulations at a constant number of particles  $N = 990$ , were performed in the Isotension-Isothermal ensemble to check that particles under this potential behave as expected. From results of chapter 3 we know that the phases to be found at high enough temperatures would be similar to those found for hard oblates [53] of the same ratio which in this case ( $a_o = 0.15$ ) yields isotropic, columnar and tilted phase. To roughly map the location of these phases isotherms lowering pressure at temperatures of  $T^* = 3.42, 3.0, 2.5, 2.0, 1.5, 1.0, 0.8, 0.6, 0.38$  and  $0.2$ , where  $T^* = T/\varepsilon$ , starting from a tilted configuration (as a sanity check at the same pressures in  $T^* = 3.42$ , simulations starting from a columnar phase were run, arriving at the same phases). After a maximum of  $8 \times 10^5$  cycles to reach equilibrium in terms of energy and nematic order parameter, this states (from points in figure 5.4) showed stability during  $8 \times 10^5$  cycles more. Where a cycle means  $N$  trials to move a particle (translate or rotate it) randomly chosen, with probability  $(1/N)$  of this move to become instead a trial to change the shape of the simulation box.

## 5.3 Results

The phases found at high temperatures meet our expectations displaying isotropic, columnar and tilted phases (fig.5.4). But this results have a drawback when we aim to reproduce the phase behaviour of laponites since a nematic phase [154] should appear at intermediate packing fractions between the isotropic and the columnar regions. Absent in this case due to the employed anisotropy  $a_o$ .

Meanwhile at low temperatures in figure 5.4 can also be located new unexpected biaxial phase (See figure 5.5) with three main populations of particles oriented perpendicularly to the other two as the angular distribution functions show. As we saw in section 3.4, at low temperature when the minimum energy

in T configuration is a global minimum, we can find the uniaxial phase. But as it appears when we add to this, the repulsion in the rest of configurations, the system reaches higher ordering forming this new phase.

This is coherent with the information given by the radial distribution functions  $g(r)$  and  $g_2(r)$  when we compare them simultaneously (see Fig. 5.6). When the later reaches values close to 1 it means that most particles at these values of  $r$  are parallel, meanwhile values close to  $-0.5$  would mean particles are oriented perpendicularly. Therefore, observing figure 5.6 we can say that particles are ordered at short distances in four main orientations. At  $r^* = 0.3$  they are parallel to each other, but this changes abruptly after  $r^* = 0.6$  where they are perpendicular. The small peaks before  $r^* = 0.8$  and at  $r^* = 1.2$  also represent particles oriented mostly perpendicular or parallel respectively to a particle set in the origin. This information is perfectly concordant with what can be observed in the snapshot, where we can observe three main populations of particles in three main orientations. Staring from any particle we will find particles of its same population oriented parallel closer than  $r^* = 0.6$ . Then at bigger distances particles from a

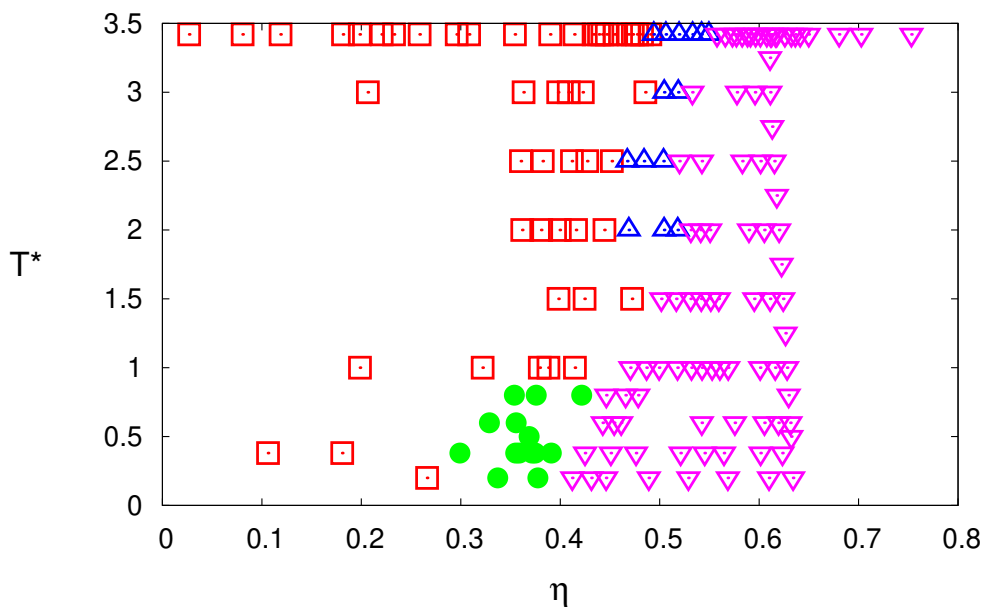


Figure 5.4: State diagram of the P potential obtained expanding a tilted configuration lowering pressure with NPTMC simulations, symbols indicate  $\square$  Isotropic,  $\bullet$  Biaxial,  $\triangle$  Columnar phase,  $\nabla$  Tilted phase.

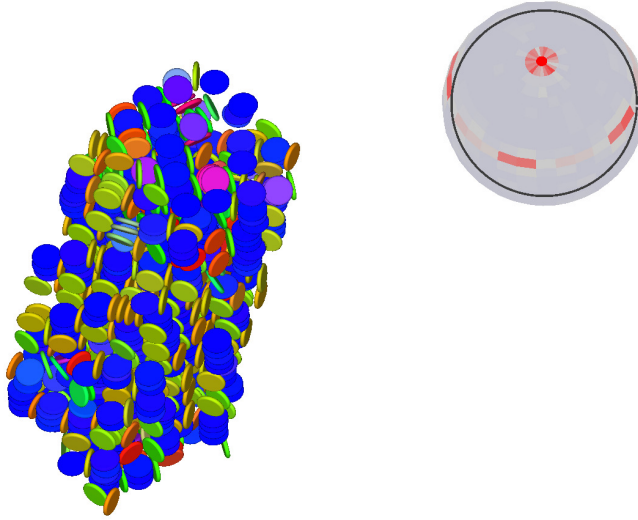


Figure 5.5: Snapshot at  $P^*=10$  and  $T^*=0.38$  for the P type potential (left), together with an histogram of the angular distribution of the particle orientations in 3D (colours depicting particles orientations).

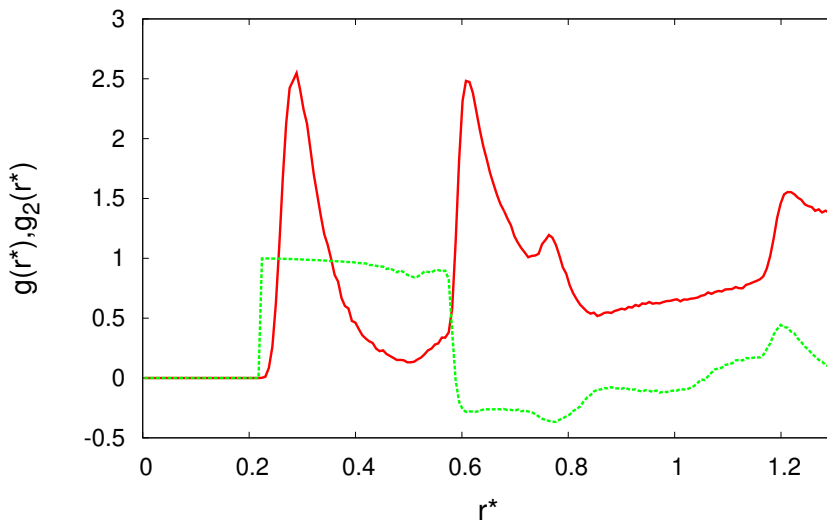


Figure 5.6:  $g_2(r)$  and  $g(r)$  in green dashed and red solid lines respectively. At  $P^*=10$  and  $T^*=0.38$  in the P potential corresponding to a biaxial phase.

second population would be oriented perpendicularly and at distances closer than  $r^* = 0.8$  a third population perpendicular to both initial ones. Finally, at distances around  $r^* = 1.2$  some particles from the first population still retain some degree of orientational order. This distribution functions show similar qualitative features as the ones provided in the literature for the particle arrangement known as "house of cards" [100, 150, 155], this features seem to be strengthened in the biaxial state due to higher compactness and therefore ordering and could be related to birefringence properties found in laponites [156] when they hold reminiscent order from a nematic phase.

## 5.4 Conclusions

To overcome the difficulty of a coarse grain model potential, to recreate particles having parts of its surface holding an opposite charge at the same time it is proposed a modification of the OGBK potential trough and angular function. This modified coarse grain model shows similar functional shape to those obtained with charged beads distributed in a disk shape. The simulation results indicate that this potential easily produces the T shape conformation of particles at low temperatures, and what is even more interesting, a biaxial state at low temperatures, roughly between packing fractions  $\eta = 0.3$  and  $\eta = 0.4$ , where we can observe three main populations of particles standing in perpendicular orientations to the rest. At high temperatures, the phases obtained confirms that even after this modification of the model, the phase behaviour is similar to hard oblates spherocylinders of the same shape anisotropy  $a_o = 0.15$ . This makes the model deviate from the expected phase behaviour of laponites where the nematic phase is expected [154]. This fact motivates the implementation of different functional forms in future studies, i.e. of Yukawa type.



## Final Conclusions

The main conclusion of this thesis is that the interplay between shape anisotropy and interaction anisotropy of colloidal particles can lead to different scenarios according to thermodynamic state of interest. Through fine-tuning of particles shape and interactions, their self-assembly can be controlled to obtain a desired outcome. This thesis investigates the reach of specific properties of individual particles into the behaviour of the substance they compose. From all the results obtained the most important findings are concisely exposed below:

1. The ability of prolate particles in nematic liquid crystal phases to diffuse faster than their oblate counterparts can be relatively quantified in different ways.
2. An ellipsoidal Gaussian distribution function can accurately model the apparent non Gaussianity of the diffusion of spherocylinders at intermediate times.
3. The same known phases of hard oblate spherocylinders appear at high enough temperatures for the OGBK model at shape anisotropies of 0.1.
4. Smectic-discotic state can be achieved if the edge to edge interaction is an absolute energy minimum of the possible relative orientations.
5. Cubatic state can be achieved if the cross configuration interaction is an absolute energy minimum of the possible relative orientations.



6. Uniaxial state can be achieved if the "T" configuration interaction is an absolute energy minimum of the possible relative orientations.
7. Oblate spherocylinders display different aggregation states in the same thermodynamic conditions if the intensity of their interactions is anisotropic.
8. Their aggregation rates increase if the more intense interaction is oriented towards the revolution axis of the oblate spherocylinder and decrease if it is oriented toward the edges of it. Provoking a subdiffusive regime in both cases at high temperatures where aggregation still occurs.
9. Aggregates of columnar shapes can be obtained in oblate spherocylinders where face to face interaction is an absolute energy minimum of the possible relative orientations.
10. Aggregates of flat shapes can be obtained in oblate spherocylinders where edge to edge interaction is an absolute energy minimum of the possible relative orientations.
11. The phases obtained at low density and temperature for oblate spherocylinders is dominated by anisotropies in their pair interactions, due to the formation of clusters with different shapes.
12. The proposed modification of the OGBK model is able to qualitatively reproduce the behaviour of laponite at low density and temperature. Forming a new phase (Biaxial) with similar ordering to the previously known "House of cards" structure, but higher packing fraction.

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# Contributions to the scientific community

## List of peer-reviewed publications

1. Morillo, N., Patti, A., & Cuetos, A. (2019) Brownian dynamics simulations of oblate and prolate colloidal particles in nematic liquid crystals. *J. Chem. Phys.* (Accepted 6 May 2019)
2. Cuetos, A., Morillo, N., & Patti, A. (2018). Fickian yet non-Gaussian diffusion is not ubiquitous in soft matter. *Physical Review E*, 98(4), 042129.
3. Cuetos, A., Morillo, N. & Martínez-Haya, B. Coadsorption of charged colloids at air-solution interfaces: a bidimensional coarse-grained simulation study (Manuscript in preparation)
4. Todinova, A., Contreras-Bernal, L., Salado, M., Ahmad, S., Morillo, N., Idígoras, J., & Anta, J. A. (2017). Towards a universal approach for the analysis of impedance spectra of perovskite solar cells: equivalent circuits and empirical analysis. *ChemElectroChem*, 4(11), 2891 – 2901.

## Oral and poster communications to:

1. II Workshop de Simulación Molecular
2. STATPHYS 26
3. IX J2IFAM
4. FisEs' 17
5. Thermodynamics Conference 2017
6. J2IFAM 2018
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