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Disclosing the molecular structure and dynamics of naphthalene diimide based organic semiconductors at solid state.

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Abstract

Naphthalene diimide (NDI) based molecules are soft organic functional materials investigated for their n-type semiconducting properties and, recently, for their coupled electronic and ionic transport properties. Such quality makes them potential candidates as mixed ionic-electronic conductors (OMIECs) for electrochemical energy storage devices and bioelectronic sensors. A key aspect is the rationalization of their solid-state structure and morphology, ultimately controlling the transport properties. Here, we introduce two newly synthesized NDIs, namely **NDI-TEG**, functionalised with linear triethylene glycol side chains, and **NDI-crown**, with 15-crown-5 rings. Their bulk structural properties, investigated via experimental characterizations and state-of-the-art molecular dynamics (MD) simulations, are compared with those of the parental species **NDI-C10**, featuring symmetrical *n*-decyl side chains. Our MD simulations reproduce remarkably well the experimental crystal structures of **NDI-C10** and **NDI-TEG**. At the same time, we compute *ex novo* the amorphous morphology of **NDI-crown**, by simulating the experimental film casting conditions. Order parameters and correlation functions allow us to provide detailed atomistic insights into both short- and long-range order, as well as to disclose the thermal disorder effects, highlighting the role of the functional side groups. Our study establishes a validated computational ground for modelling NDIs in condensed solid phases, benchmarking the procedure with respect to experimental XRD data, and extending it to amorphous films, thus paving the way for an in-depth understanding of the structure-property functions of small molecule n-type semiconductors.

Introduction

Naphthalene diimide (NDI) based compounds stand out due to their high stability and electron mobility, outperforming other rylene diimide-based systems.^{1,2} Facile tuning of the lowest

unoccupied molecular orbital (LUMO) energy levels provide access to bench-stable materials with high operational stability in organic electronic devices and low susceptibility to deleterious side-reaction involving e.g. water and oxygen. Beside being studied for their exceptional supra-molecular properties³ and n-type semiconducting characteristics,⁴ NDIs have recently been investigated as organic mixed ionic-electronic conductors (OMIEC).⁵

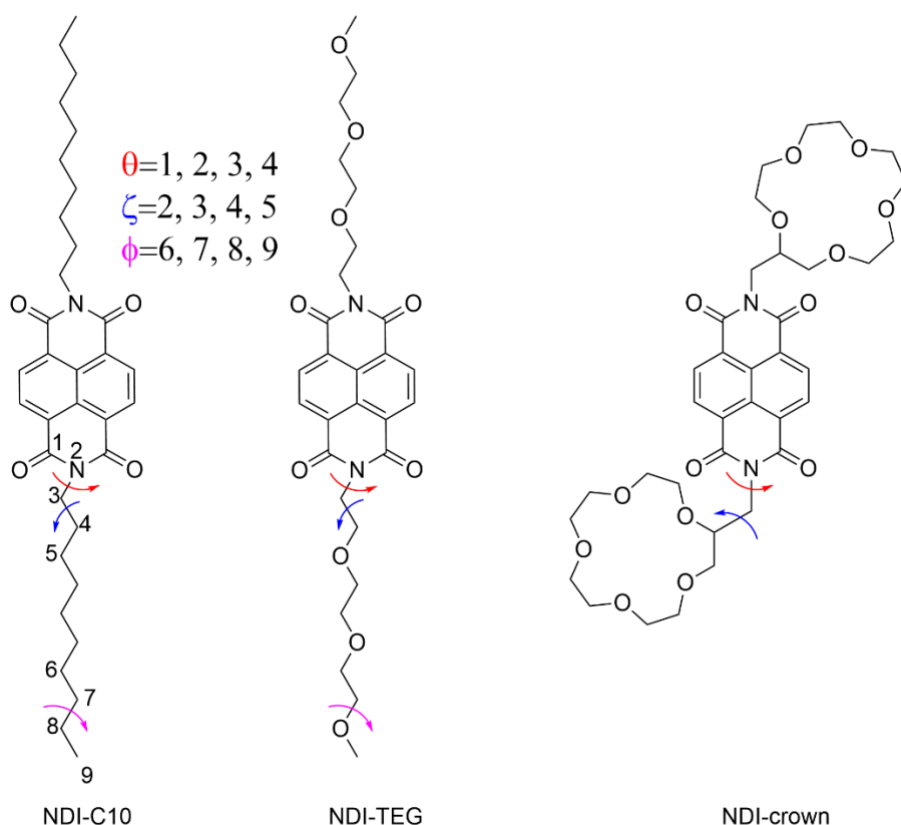
OMIECs are a rising and promising class of soft functional materials (conjugated molecules or polymers) able to conduct both ionic and electronic charges (e.g. electron, hole)⁶⁻¹². Such coupled conduction mechanisms, together with the facile solution processability and chemical synthesis, has led to the application of OMIECs in devices where the ionic transport is crucial, ranging from organic electrochemical transistors,¹³⁻¹⁵ light-emitting devices,¹⁶⁻¹⁸ optoelectronics,¹⁹ biosensors²⁰ to energy storage systems.²¹⁻²⁴

The performance of organic semiconductors, and in particular of OMIECs, is tied to the solid state morphology, which dictates among others the water/ions penetration, the ionic and electronic transport properties, and the overall device functionality.^{11,25} OMIECs structure-function rules can be inferred from experimental data, namely the π -stacking and short/long-range order enhances the electronic transport, while polar side chains govern the ionic diffusivity by influencing the solubility, packing motifs and solvent intake.^{26,27} However, achieving precise control over OMIECs morphology and functionalities remains a critical challenge.^{23,28-34}

Small-molecule OMIECs offer an attractive platform for fundamental investigations.³⁵ In this case, fixing the central π -conjugated chromophore and exploring different functionalisations to the periphery of the system (e.g., side chain variations, halogen substitutions, etc.) provide access to closely related systems with wide-ranging differences in e.g. morphological and electronic characteristics. Notably, NDI-based molecules exhibit a complex morphological landscape.³⁶⁻³⁸ Depending on the side functional groups, the solid state structures may feature various degrees of order, ranging from crystalline, showing a quite rich and heterogeneous polymorphism, or liquid crystal phases. Paradigmatic examples are **NDI-C6** (i.e., *n*-hexyl side chains), showing at least four different polymorphs, depending on the thermal treatment and deposition method, and **NDI-C10**, featuring a polymorphic transition followed by a liquid crystal phase close to the melting point.^{36,37}

Despite this rich body of work, the structure-dynamics relationships of NDIs at solid state remain largely underexplored. We therefore focus on elucidating the morphology and time-correlation dynamics of three NDI derivatives with distinct functionalised side-chains. By systematically combining crystallographic characterizations and extended molecular dynamics (MD) simulations, we provide atomistic-level insight into how chemical modifications dictate the crystalline versus amorphous nature, packing motifs, and local ordering phenomena. Such structural insights are instrumental for interpreting future mixed conduction measurements, and serve as an essential benchmark for developing predictive design rules of small-molecule organic conductors.

Starting from the single crystal of **NDI-C10**,³⁶ symmetrically functionalized with *n*-decyl side chains, we provided to the best of our knowledge the first all-atom computational study (i.e., force-field molecular dynamics (MD) simulations) of such species, parametrizing the force field at best to reproduce the experimental X-Ray Diffraction (XRD) data. Following this computational validation, we extended our analysis to two newly synthesised NDI derivatives: **NDI-TEG**, which incorporates linear triethylene glycol side chains, and **NDI-crown**, functionalized with 15-crown-5 rings (**Scheme 1**). The hydrophilic oligoether side chain (such as triethylene glycol) is a popular motif in OMIECs molecular design enabling interactions with hydrated ions while the cyclic crown ether derivatives offer cation-selective interactions dictated by the radius of the crown ether and the ionic radius of the cation.³⁹ These functionalisations draw inspiration from perylene diimide systems,^{40,41} where similar side groups have shown promising results towards enhancing the ion selectivity as well as the electron transport for mixed ionic-electronic conductor applications. **NDI-TEG** is highly crystalline, while **NDI-crown** is amorphous as confirmed by thin-film X-ray diffraction (see Electronic Supporting Information (ESI), Figure S9). Our extended atomistic MD simulations successfully reproduce the experimental crystal structure of **NDI-TEG**, and at the same time compute *ex novo* the amorphous morphology of **NDI-crown**. Finally, through a combined use of structural order parameters and correlation functions, we characterize both short- and long-range order of each NDI species in the solid state, thus paving the way for an in-depth understanding of their structure-property functions towards their use as organic mixed ionic and electronic conductors.



Scheme 1. Chemical structures of **NDI-C10**, **NDI-TEG** and **NDI-crown**, along with the definition of the dihedral angles θ , ζ , and ϕ analysed in this work (*vide infra*). The same dihedral

definitions (see colour code) are applied to **NDI-TEG** and **NDI-crown**. For **NDI-TEG** and **NDI-crown** atoms 5 and 8 are oxygen.

Methods

Details about the experimental methods (e.g., materials, synthesis, thermogravimetric analysis, differential scanning calorimetry, X-ray diffraction data) are reported in the ESI file.

Molecular Dynamics Simulations

MD simulations were performed *via* LAMMPS-2Aug2023^{42,43} on supercells of **NDI-C10**, **NDI-TEG** and **NDI-crown**. The bonded parameters were taken from the OPLS-AA force field (version 2020),⁴⁴ that has been already employed in several MD studies about OMIECs.^{45–49} Bonds involving hydrogen atoms were constrained using the SHAKE algorithm.⁵⁰ The usage of appropriate force constants ensured the planarity of the NDI core. The supercell for **NDI-C10** is a 8x8x8 (containing 512 molecules), generated from the experimental XRD structure taken from the Cambridge Crystallographic Data Centre (CCDC 1972224).³⁶ To reproduce the single crystal structure via MD simulations, a careful re-parametrization of some force field terms is generally required. In this study, we re-parametrized the non-bonded terms via the following procedure. The non-bonded (e.g., van der Waals) parameters were obtained in two ways: i) standard values, as provided by OPLS-AA/2020, ii) recomputed values, by following the procedure reported in Refs. 51–53, that is performing quantum chemical calculations to derive appropriate partial charges (*vide infra*) and effective volume of the atoms, for then applying the Tkatchenko-Scheffler (T-S) method.^{51–53} The quantum chemical calculations were performed with Gaussian16⁵⁴ considering the ω B97X-D2 range separated functional and the def2-TZVPP basis set.^{55–57} The **NDI-C10** (single molecule) structure was optimized starting from the XRD geometry (CCDC 1972224).³⁶ The partial charges were evaluated using two population analysis schemes, namely CHELPG and DDEC6 (density-derived electrostatic and chemical electron density partitioning).^{58–61} DDEC6 charges were computed using the Chgemo program. We ran four sets of MD simulations by exploiting all different combinations between non-bonded parameters and partial charges (that is, OPLS with standard non-bonded parameters and either CHELPG or DDEC6 atomic charges, OPLS with recomputed non-bonded parameters via the Tkatchenko-Scheffler (T-S) method (here named OPLS/T-S) and either CHELPG or DDEC6 atomic charges).

After energy minimisation, the system was equilibrated in the NVT ensemble at 300 K for 1 ns. The Nosé–Hoover thermostat was used with a time constant of 0.2 ps. The MD integration time step was 2 fs. For the Coulomb interactions, the particle-particle particle-mesh for long-range electrostatics method was used, and the van-der-Waals and Coulomb cut-offs were set to 1.2 nm. Then, a 20 ns simulation was performed in the NPT ensemble with Nosé–Hoover barostat and Martyna, Tuckerman, and Klein correction, at 300 K and 1 atmosphere, with a time constant of 2 ps. The barostat was first set such as only *isotropic* cell fluctuations were allowed, that is the cell angles are constrained and the dilations/compressions are coupled in all three

directions (*iso* keyword in LAMMPS). By constraining the crystal cell to isotropic variations, we can isolate the contribution of the non-bonded parameters and atomic charges on the resulting mass density. The properties were finally averaged over the last 10 ns. After this first validation phase, the protocol that better reproduced the **NDI-C10** density (i.e. OLPS/T-S and DDEC6 charges) was applied to both **NDI-C10** and **NDI-TEG**, this time with *anisotropic* cell fluctuations for the production runs.

For **NDI-TEG** we considered a 5x5x5 supercell (each unit cell contains 4 molecules, in such way a similar number of molecules as for **NDI-C10** is considered in the MD simulations) starting from the experimental XRD structure, as derived in this work. The non-bonded parameters have been computed with the T-S method, and the partial charges with the DDEC6 scheme. After energy minimisation, the system was heated in the NVT ensemble from 0 K to 300 K in 3 ns. A subsequent equilibration in the NVT ensemble at 300K was performed for 1 ns. With respect to the benchmarking protocol defined above, we introduced a gentle heating from 0 K to 300 K in 3 ns to minimise the morphology fluctuations in the NVT ensemble. Production run was performed in the NPT ensemble at 300 K and 1 atmosphere for 20 ns. Triclinic cell fluctuations were allowed with the keyword *tri* in LAMMPS. The time constants of the thermostat and barostat are the same as defined above.

For **NDI-crown** we employed a similar simulation protocol as reported in Ref⁶², to generate an amorphous thin film morphology as obtained from deposition of chloroform solution.⁶²⁻⁶⁴ The force field employed is the same as for **NDI-C10** and **-TEG** (OPLS/T-S with DDEC6). After energy minimisation, the system (500 molecules in the simulation box) was heated from 0 K to 500 K in 5 ns with the usage of the Langevin thermostat and Nosé-Hoover barostat, setting the pressure to 1 atmosphere and the time constant to 2 ps. The damping parameter of the Langevin thermostat was 3.8 ps⁶². The dielectric constant of chloroform, 4.81, was employed to scale the electrostatic interactions. Subsequently, the system was simulated for 30 ns at 500 K and then cooled from 500 K to 300 K in 5 ns, with the same setting used during the heating process. The final production run was performed in the NPT ensemble for 30 ns, using the Nosé-Hoover thermostat and barostat, at 300 K and 1 atmosphere, the dielectric constant was set to 1.0.

Structural Analyses

The radial distribution functions (RDF) considering the nitrogen atom belonging to NDI pairs and dihedral distribution functions (DDF) (see **Scheme 1** for the definition of the dihedral angles considered in our analysis) were computed with the code TRAVIS.^{65,66} The molecular orientational order parameter Q was also considered to study the long range orientational order. Q is defined as the largest eigenvalue of the Saupe ordering matrix $Q_{\alpha\beta}$,⁶⁷⁻⁷³ namely

$$Q_{\alpha\beta} = \frac{1}{N} \sum_{i=1}^N \left(\frac{3}{2} \vec{u}_{\alpha}^{(i)} \vec{u}_{\beta}^{(i)} - \frac{1}{2} \delta_{\alpha\beta} \right) \quad (1)$$

where the index i runs over the number of molecules N , $\vec{u}_\alpha^{(i)}$ is a vector describing the molecular orientation and the indices α and β run over the three cartesian coordinates (x, y, z), that is over the three vector components. Q ranges from 1, when all molecules are oriented in the same direction and the system is perfectly ordered, to 0 when all molecules are randomly oriented and the system is disordered. The orientational order parameter was computed with MDTraj.⁷⁴

Results and Discussion

NDI-C10. We focus on the room temperature polymorph of **NDI-C10**, the only species investigated in this study that is already reported in literature,³⁶ which shows a triclinic unit cell. The NDI cores are stacked in layers separated by the side chains, the latter adopting an *all-trans* conformation, as shown in **Figure 1**.

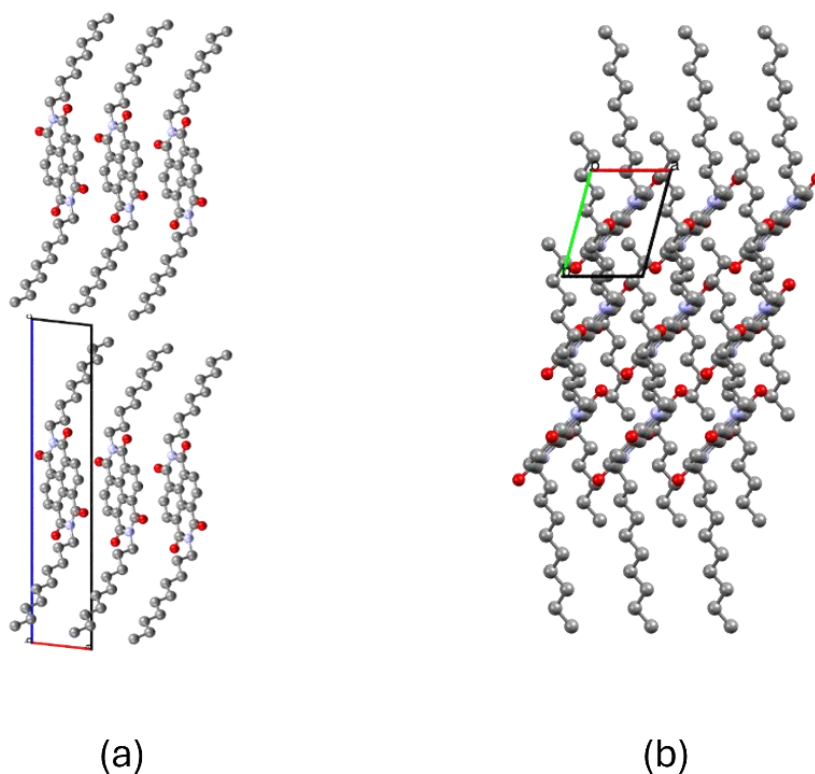


Figure 1. Experimental **NDI-C10** crystal structure.³⁶ Lattice vectors (a , b , c) are reported in red, green and blue, respectively. View along the b vector (panel a) and from the c vector (panel b).

At first, we validated the atomistic force field based on the experimental XRD data. As reported in Methods, we relied on the OPLS/2020 (from now on OPLS) for the bonded parameters by describing here only the fundamental role played by the non-bonded parameters and atomic charges in determining the structural and thermodynamic properties of crystalline **NDI-C10**. Aiming at reproducing the experimental crystal density, we tested four combinations in our MD simulations, namely: OPLS with standard non-bonded parameters and either CHELPG or DDEC6 atomic charges, OPLS with recomputed non-bonded parameters via the Tkatchenko-Scheffler (T-S) method (OPLS/T-S) and either CHELPG or DDEC6 atomic charges. While the OPLS non-bonded parameters and the CHELPG charges are extensively used in literature, the recomputed T-S non-bonded parameters together with the DDEC6 scheme have been recently proved successful in reproducing the elusive glass transition temperature in polymers⁵¹ and in the simulation of biomolecules.⁵³ In our force field validation phase, we restricted the cell to *isotropic* fluctuations, constraining the crystal cell angles to their experimental value. In this

way, we can isolate the contribution of the non-bonded parameters and atomic charges on the calculation of the density. Main results are summarized in

Table 1.

Table 1. Experimental and computed mass densities (g/cm^3) of the **NDI-C10** crystal computed with four combinations of non-bonded parameters (OPLS, meaning the OPLS/2020 non-bonded parameters, OPLS/T-S for recomputed non-bonded parameter with T-S procedure, see Methods) and atomic charges (CHELPG or DDEC6). Percentage error between brackets.

	CHELPG	DDEC6
OPLS	1.145 (2.93%)	1.144 (2.93%)
OPLS/T-S	1.214 (2.93%)	1.185 (0.51%)
Experimental density ³⁶	1.179	

The usage of standard OPLS non-bonded parameters underestimates the densities, which are almost insensitive to the choice of the atomic charges. Instead, the recomputed non-bonded parameters (OPLS/T-S) in combination with the CHELPG charges overestimates the density, while their combination with the DDEC6 produces the best match with the experimental data, leading to a supercell density equal to $1.185 g/cm^3$, that is a 0.51% deviation from the experimental value of $1.179 g/cm^3$. Considering the above results, we found that our reparametrized OPLS/T-S force field, in combination with DDEC6 charges, can be considered the best interaction potential for reproducing NDIs experimental data, therefore we considered it for all the following simulations.

Once the force field was benchmarked, we ran a production simulation in which the cell edges and angles can vary independently. On this MD trajectory we performed the structural analyses reported in **Figure 2**.

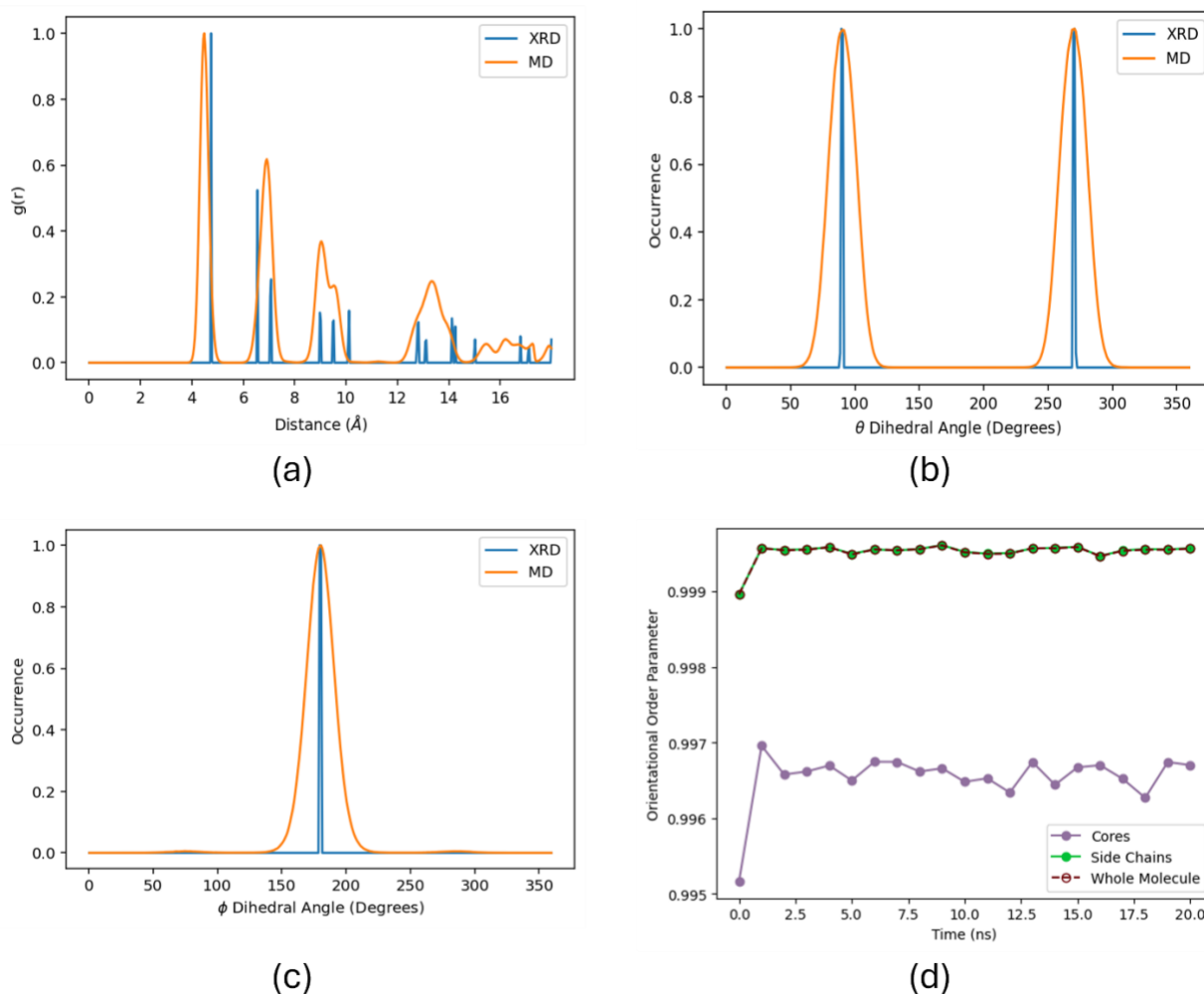


Figure 2. Structural analyses of the simulated **NDI-C10** crystal structure (MD data, orange), compared to the experimental XRD data (blue). Panel a): radial distribution function (RDF) between nitrogen atoms. Panel b): θ angle (C1-N2-C3-C4, see **Scheme 1**) dihedral distribution function (DDF) (full width at half maximum – FWHM – equal to 25° for both peaks), and panel c) ϕ angle (C6-C7-C8-C9) DDF (FWHM equal to 25°). Panel d): order parameter Q (equation 1) computed considering three schemes: orientation of only the molecular cores (violet data), orientation of only the -C10 side chains (green data), or orientation of the whole molecule (brown data).

The MD computed radial distribution function (RDF, **Figure 2a**) nicely overlaps the one computed on the experimental crystal structure (XRD), proving the effectiveness of our simulation protocol (*anisotropic* cell variations) and the validity of the re-parameterized force field (OPLS/T-S, DDEC6) in reproducing the **NDI-C10** crystal structure. The computed principal peak, representing the first coordination shell between nitrogen atoms belonging to nearest-neighbour NDI pairs, slightly down shifts with respect to the experimental value, being 4.48 \AA (MD) vs. 4.75 \AA (XRD) (**Figure 2a**). This is ascribable to a slight volume compression with respect to the experimental cell reflected in a small increase of the mass density (1.263 g/cm^3 from MD vs. 1.179 g/cm^3 from XRD). The a and c cell vectors slightly shrink by 5.55% and 4.10%, respectively, with vector a representing the direction of the π - π stacking. Cell vector b undergoes a 3.55% dilation. The deviation of the computed RDF peaks around 16 \AA is due to the compression along the c vector.

Concerning the side chain conformations along with the dynamics, the dihedral angle θ dictates the direction of the alkyl chains with respect to the NDI core (C1-N2-C3-C4, **Scheme 1**). Its dihedral distribution function (DDF), reported in **Figure 2b**, shows two peaks since the two side chains are oppositely oriented with respect to the NDI plane (**Figure 1**). The position of the experimental and simulated peaks is the same, lying at 90° and 270° , and the full width at half height of the distribution is equal to 25° for both peaks, showing that the impact of the thermal disorder ($T = 300$ K) on the simulation cell is limited to a broadening with respect to the equilibrium value and does not promote the population of other conformers. The same considerations apply to the dihedral angle ϕ (C6-C7-C8-C9, **Scheme 1**), which describes the local orientations of the terminal methyl groups. Our MD simulation reproduces the experimental peak distribution at 180° (**Figure 2c**), with a width at half height equal to 25° , as for θ . The dihedral distribution functions of other torsional angles are reported in ESI (Figure S10). Notably, the ζ angle distribution nicely reproduces the experimental data, proving that the *all-trans* chain conformation is maintained throughout the dynamics. Our finite temperature MD simulation supports the experimental crystal data for **NDI-C10** (see also Table S6, ESI), showing stacked NDI units with fully extended alkyl chains, preserving their full extension even at 300 K, therefore being resilient to thermal induced disorder effects at room temperature.

Lastly, we evaluate the global orientational order by computing the nematic order parameter Q (equation 1) throughout the entire simulation cell, over the MD production run (i.e., 20 ns). Q was computed in three different schemes, as reported in **Figure 2d**, namely by considering *a*) only the atoms belonging to the NDI cores (violet data), *b*) only the atoms of the side chains (green data), or *c*) the atoms of the whole molecule (brown dotted data). For each case Q is higher than 0.996 during the entire MD production run, revealing that the temperature does not affect the orientational ordering of the NDI cores, the side chains nor the overall crystal structure.

The perfect match between the experimental and MD based data prove that our MD methodology produces a state-of-the-art description for **NDI-C10** crystal cell at room temperature.

NDI-TEG. Following synthesis and crystal growth by slow cooling of a hot concentrated solution in methanol, we successfully obtained a single crystal structure of **NDI-TEG** by X-ray diffraction (see ESI for further details and Tables S1-S5). At room temperature, **NDI-TEG** is characterised by a monoclinic crystal lattice, as depicted in **Figure 3**. The NDI cores are stacked in a columnar fashion along the *b* axis. Notably, two neighbouring NDI cores along the crystallographic *c* axis are oriented in opposite directions, one molecule inwards the *a-c* plane and one outward the *a-c* plane (**Figure 3b**). The triethylene glycol side chains show a peculiar conformation, far from the *all-trans* conformation of the parent alkyl-based **NDI-C10** species. In **NDI-TEG** side chains, only two dihedrals, the third and fifth, are close to 180° while the others adopt different conformations. In the solid state, this unique side-chain conformation enables the NDIs to

closely pack uniformly in all three dimensions without creating, in contrast to **NDI-C10**, a lamellar structure characterized by alternating layers of NDI planes and side chains.

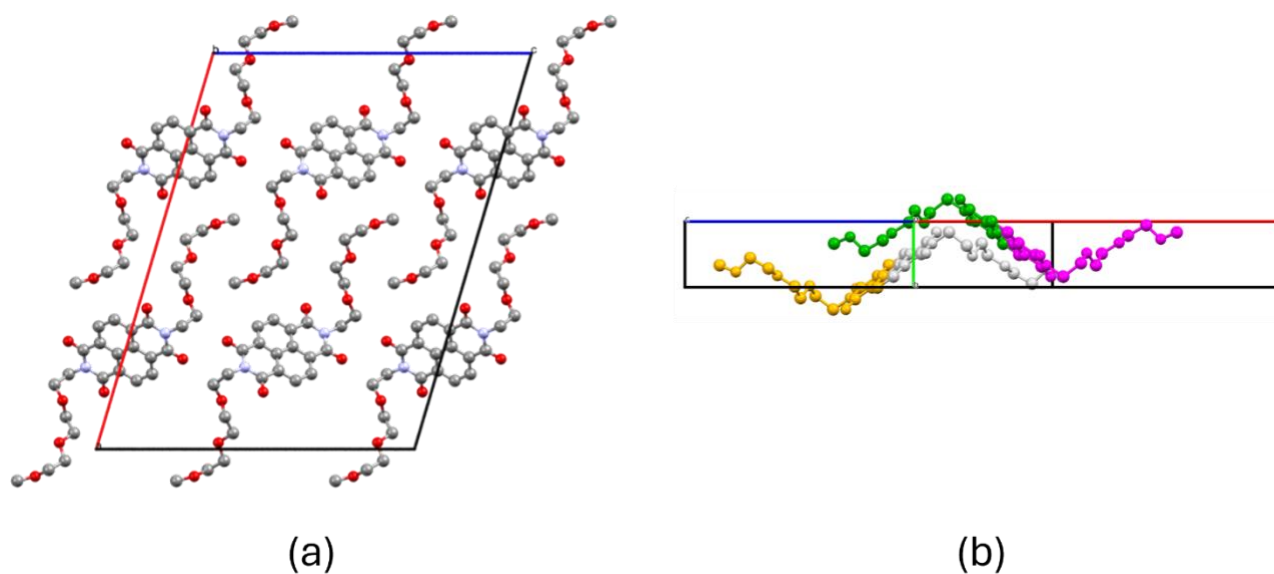


Figure 3. Experimental **NDI-TEG** crystal structure (this work, deposited structure CCDC 2456282). Lattice vectors (a , b , c) are reported in red, green, blue, respectively. Panel a): view from the b lattice vector. Panel b): two neighbouring molecules exhibiting different orientations, each colour represents an asymmetric unit.

To get atomistic insights into the **NDI-TEG** crystal structure we employed the same MD simulation protocol as benchmarked on **NDI-C10**. Remarkably, for **NDI-TEG** we were able to reproduce the experimental density of 1.376 g/cm^3 with only a 2.48% overestimation. Notably, the variations in the cell angles are less than 0.1% (ESI, Table S7), while the changes in the b and c cell edges are under 1%. Only the cell vector a exhibits a larger variation of 2.80%. **Figure 4** reports the RDF, DDF and Q order parameter analyses for **NDI-TEG**, similarly to what reported for **NDI-C10** in **Figure 2**.

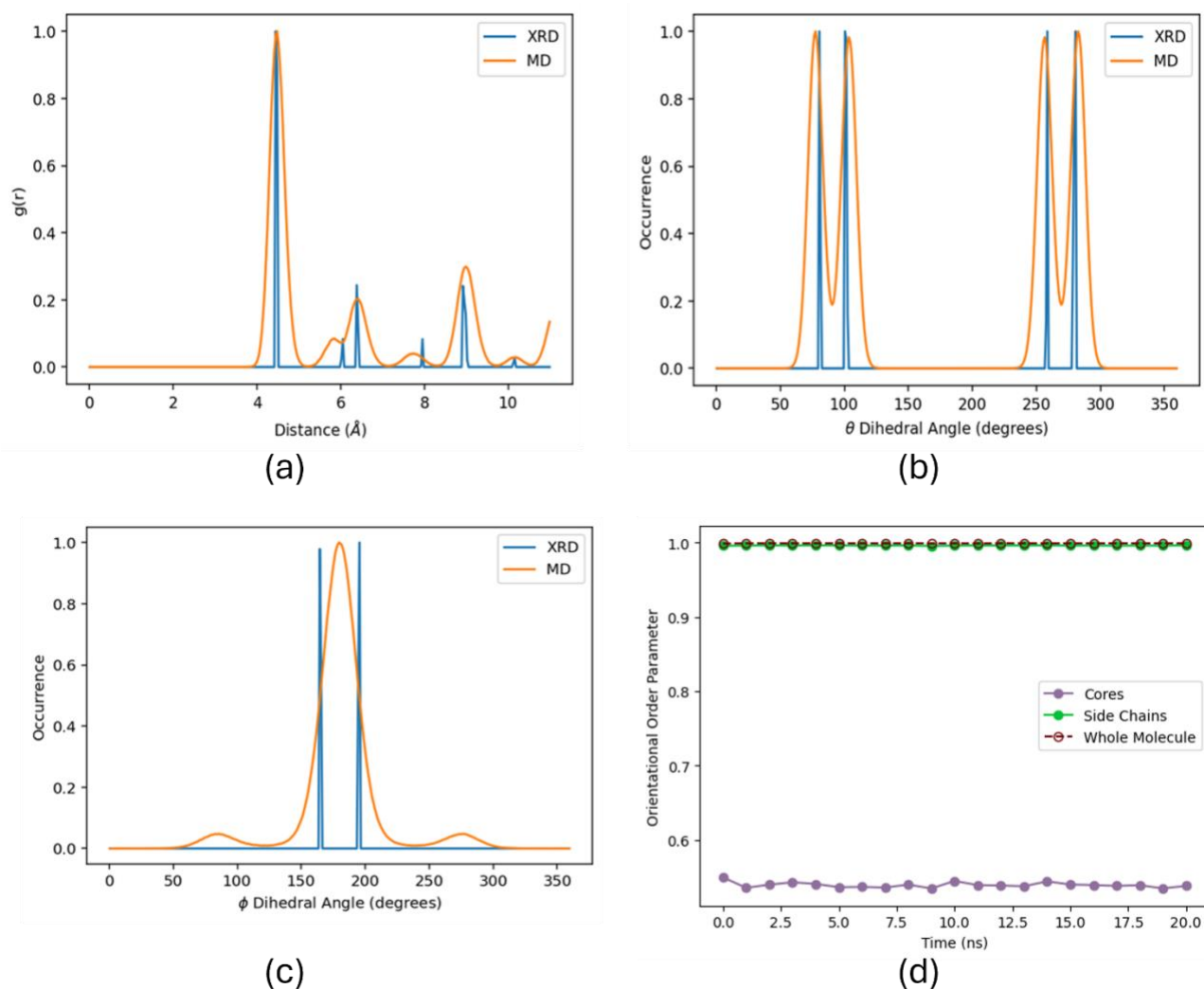


Figure 4. Structural analyses of the simulated **NDI-TEG** crystal structure (MD data, orange), compared to the experimental XRD data (blue). Panel a): RDF between nitrogen atoms. Panel b): θ angle (C1-N2-C3-C4, see **Scheme 1**) DDF (FWHM equal to 12° and 14°) and panel c) ϕ angle (C6-C7-C8-C9) DDF (FWHM equal to 30°). Panel d): order parameter Q (equation 1) computed considering three schemes: orientation of only the molecular cores (violet data), orientation of only the TEG side chains (green data), or orientation of the whole molecule (brown data).

The comparison between the MD computed and experimental RDF is quite remarkable (**Figure 4a**), showing a perfect agreement between the two. The first principal peak is computed at 4.48 \AA , close to the experimental value of 4.45 \AA . A good agreement with the experimental results is obtained also for the θ angle DDF (**Figure 4b**), which describes the rotation around the bond connecting the side chains and the NDI core (**Scheme 1**). The θ DDF of the crystal structure presents four peaks, two at 80° and 100° and two at 260° and 280° , respectively. This splitting is simply due to the choice of the frame of reference. In the crystal cell, two neighbouring cores have different orientations and the consequence is that the θ angle assumes two opposite values. In one molecule θ is 80° for one chain and 280° for the other side chain, in the neighbouring molecule θ assumes the 100° and 260° values. The peaks computed from the MD trajectory deviate at most by 4° from the experimental value and the full width at half height of

the four peaks is between 12° and 14°. The terminal dihedral angle of the TEG chains, ϕ , is more elusive (**Figure 4c**). In the crystal structures ϕ can be 165° or 195°, during the finite temperature MD simulation ϕ assumes the average value of 180° and the associated peak has a full width at half height of 30°. The thermal effects during the MD average the distribution of the principal peak and promote two smaller peaks at 85° and 276° (**Figure 4c**). Also the ζ angle, the first dihedral angle that influences the conformation of the side chain (**Scheme 1**), is in good agreement with the XRD data (Table S7 and Figure S11, ESI), reproducing the gauche and gauche prime orientations of the side chain.

Despite these thermal effects, the nematic order parameter Q confirms the overall reproduction of the experimental crystal cell structure (**Figure 4d**). The ordering of the side chains and of the entire molecules is remarkably close to the crystal experimental case, showing a Q larger than 0.98. The Q parameter computed considering only the NDI cores can reach at most the value of 0.5, since two neighbouring cores have opposite spatial orientation in the experimental crystal cell. In our simulation the Q parameter of the cores is close to 0.5 and thus the spatial order of the cores is perfectly maintained throughout the entire dynamics at 300 K.

NDI-crown. After synthesis, all attempts at growing a suitable single crystal of **NDI-crown** were unsuccessful, implying that the morphology cannot be determined through XRD measures at present (see details in ESI, Figure S9). Insights into its atomistic structure can however be provided by our MD simulations, having re-parametrized and benchmarked the force field for both **NDI-C10** and **NDI-TEG** derivatives. In such way, it would be possible to generate reasonable morphologies for the amorphous phase. Here, we employed the previous parametrization scheme to simulate a **NDI-crown** thin-film deposited from chloroform, reflecting typical experimental conditions. The resulting amorphous morphology is shown in **Figure 5**, while the structural analyses on the computed morphology are shown in **Figure 6**.

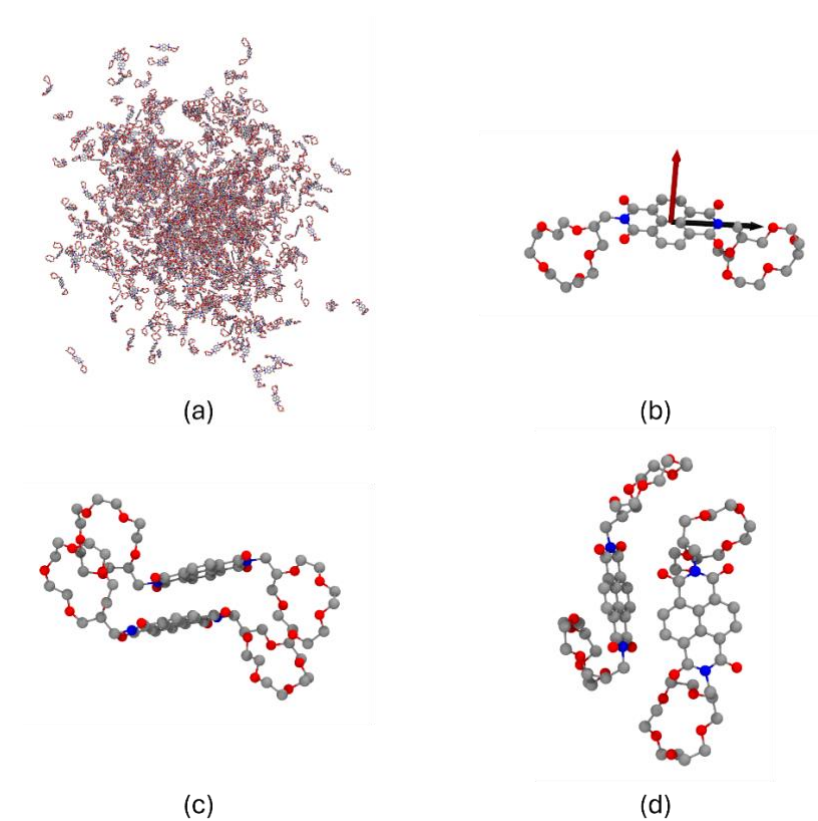


Figure 5. Panel a): amorphous **NDI-crown** MD generated morphology. Panel b): **NDI-crown** monomer along with the representation for the vectors parallel (blue) and normal (red) to the molecular core used in the structural correlation analyses (*vide text*). Panel c) and d): examples of **NDI-crown** π - π dimer and edge-on dimer as extracted from the MD simulation box.

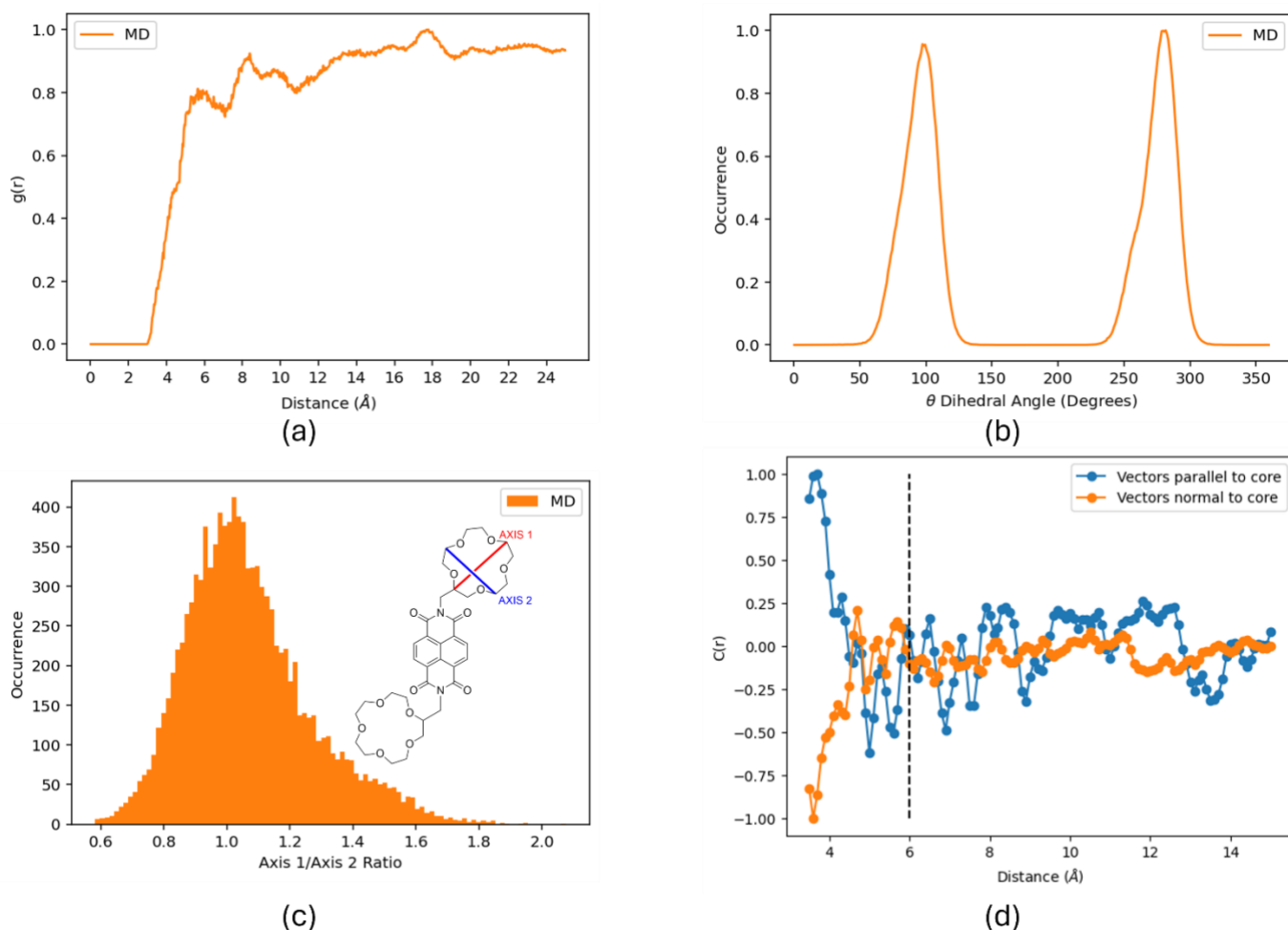


Figure 6. Structural analyses of the simulated **NDI-crown** amorphous structure. Panel a): RDF between nitrogen atoms. Panel b): θ angle (C1-N2-C3-C4, see **Scheme 1**) DDF (FWHM equal to 27° and 30°). Panel c): histogram of the ratio between two axes (axis 1 (red) and axis 2 (blue)) of the 15-crown-5 ring. Panel d): spatial correlation function $C(r)$ (equation 3) of the fluctuations of the vectors parallel (blue) and normal (orange) to the NDI core (see also blue and red vectors in **Figure 5**). Vertical dotted line marks the loss of short range order.

The resulting density of the simulation cell is 1.304 g/cm^3 , similar to the **NDI-TEG** density. The RDF (**Figure 6a**) confirms that the structure is amorphous, characterized by a lack of long-range structural order. In such scenario, the analysis of the θ angle is especially relevant (**Figure 6b**). First, the two peaks located at 97° and 281° present a full width at half height equal to 30° and 27° , respectively, and are skewed towards smaller values with respect to the centre of the peak. The broadening is higher than the counterpart evaluated for **NDI-C10** and **NDI-TEG**, indicating that thermal disorder effects on the 15-crown-5 side chains are slightly higher than the ones on the *n*-decyl and triethylene glycol chains. Moreover, the θ angle dictates whether the 15-crown-5 motifs are placed either at the same side with respect to the NDI plane (*syn* isomer), or at opposite sides with respect to the NDI plane (*anti* isomer), see ESI Figure S14 for a structural representation of the isomers. We found that our simulation time (30 ns at 500K and 30 ns at 300K) is sufficient to obtain a stable *syn/anti* distribution converging to 48% molecules in *syn* and 52% in *anti*.

To better characterize the structural properties of **NDI-crown**, we check the circular aspect ratio (roundness) of the crown ether side chain, namely the ratio between the two inner-circle axes (axis 1 and axis 2), as defined in **Figure 6c**. Such geometrical properties are fundamental since the size and shape of the crown ethers influence, for instance, the binding selectivity to ions⁷⁵. The distribution of the axis 1 / axis 2 ratios (**Figure 6c**) shows a mean value equal to 1.067, with a 0.200 standard deviation. The mean value of axis 1 is 5.95 Å, while the mean value of axis 2 is 5.69 Å, indicating that during the dynamics the 15-crown-5 motif nicely approximates the shape of a circle, by keeping its roundness. It must be noticed that in the calculation of the radii the atoms are treated as points, not considering the van der Waals radii.

Given the overall lack of long-range structural order, as proven by the RDF (**Figure 6a**) as well as by the calculation of the nematic order parameter Q which is close to zero (Figure S12, ESI), we investigate the local dynamics and structural correlation between the NDI cores to get insights into their short-range order and collective dynamics of **NDI-crown**.

To this aim, we resort to the analysis of structure-based correlation functions as introduced by Cavagna et al. studying general disordered systems,⁷⁶ ranging from glasses to living systems, such as bacteria and bird flocks. In ref⁷⁶ Cavagna et al. study the local and collective *spatial* behaviour of birds within a flock during the fly time. We translate such approach to describe *how the movement of a molecule is correlated to another one within the amorphous phase*, thus solving their *collective spatial dynamics*. We start by defining the behavioural state to observe considering a vector parallel to the NDI core (i.e., connecting the two nitrogen atoms, see blue arrow in **Figure 5b**) and a vector normal to the NDI core (see red arrow in **Figure 5b**). This vector dyad describes the orientation of the NDI plane in space. The fluctuation vector (\vec{f}_i) of a specific NDI core (named here, site i) around the positional mean computed for all NDIs (N) is defined as

$$\vec{f}_i = \vec{p}_i - \frac{1}{N} \sum_{k=1}^N \vec{p}_k \quad (2)$$

where p can either be the vector parallel or normal to the NDI plane. Large \vec{f}_i indicates that the positional orientation of a molecule (\vec{p}_i) is considerably different from the average orientation of the whole system (called polarization in Ref⁷⁶). To study possible correlations occurring between *local positional fluctuations* of NDIs, the spatial correlation function of the fluctuated vectors is computed, reading as

$$C(r) = \frac{1}{c_0} \frac{\sum_{ij} \vec{f}_i \vec{f}_j \delta(r - r_{ij})}{\sum_{ij} \delta(r - r_{ij})} \quad (3)$$

where $\delta(r - r_{ij})$ is a smoothed Dirac δ -function acting on the distances r_{ij} between the centres of the NDI cores. c_0 normalises the largest value of the function (in absolute value) to 1, so the correlation function ranges from -1 to 1. When $C(r)$ has large positive values, the vector fluctuations are almost parallel and therefore correlated. In our case this occurs when the vectors defining the orientation of the NDI cores are moving in the same direction. When $C(r)$

has large negative values, the fluctuations are antiparallel and anticorrelated, so the vectors are moving in opposite directions. The correlation function is zero when the fluctuations are randomly oriented. Equation 3 therefore provides spatial information, specifically, how the movement of one NDI core influences the movement of the others.

Figure 6d depicts the computed $C(r)$ as defined in equation 3, for both parallel ($C^p(r)$, blue data) and normal ($C^n(r)$, orange data) NDI vectors. For short distances, smaller than 5 Å, the structural fluctuations of the vectors parallel to the cores are correlated ($C^p(r) > 0$), while those of the normal vectors are anticorrelated ($C^n(r) < 0$). A positive correlation of $C^p(r)$ implies the existence of molecular aggregates where the NDI cores tend to be aligned in the same direction (in-plane correlation). Such aggregate configurations can be achieved either via a π - π stacking of the NDI plane (**Figure 5c**) or an edge-on packing (**Figure 5d**), where the NDI cores are perpendicular to each other, still maintaining the long axis vectors (blue vector, **Figure 5b**) parallel. This finding reveals the existence of a *short-range structural order* between the NDI cores. The negative values for $C^n(r)$ reflect an anticorrelation between the normal vectors of NDIs, thus implying a short-range order however with vectors pointing in opposite direction. Both $C^p(r)$ and $C^n(r)$ suggest that on average across the bulk **NDI-crown** self organizes in local aggregates (e.g., dimers, trimers) with packing motifs that can range from π - π , edge-on or tilted stacking. For distances larger than 5 Å both $C^p(r)$ and $C^n(r)$ decay to small values, close to zero, indicating absence of spatial correlation, therefore long-range disorder.

Comparative analysis

Having fully characterized the short- and long-range structural order of **NDI-C10**, **NDI-TEG** and **NDI-crown**, we now compare the three species with a view to emphasise some preliminary *structure-property* functions. In **Figure 7** we report the radial distribution function, the coordination number and the dihedral distribution function of each system to underline different structural properties of NDIs, ultimately related to their molecular structure.

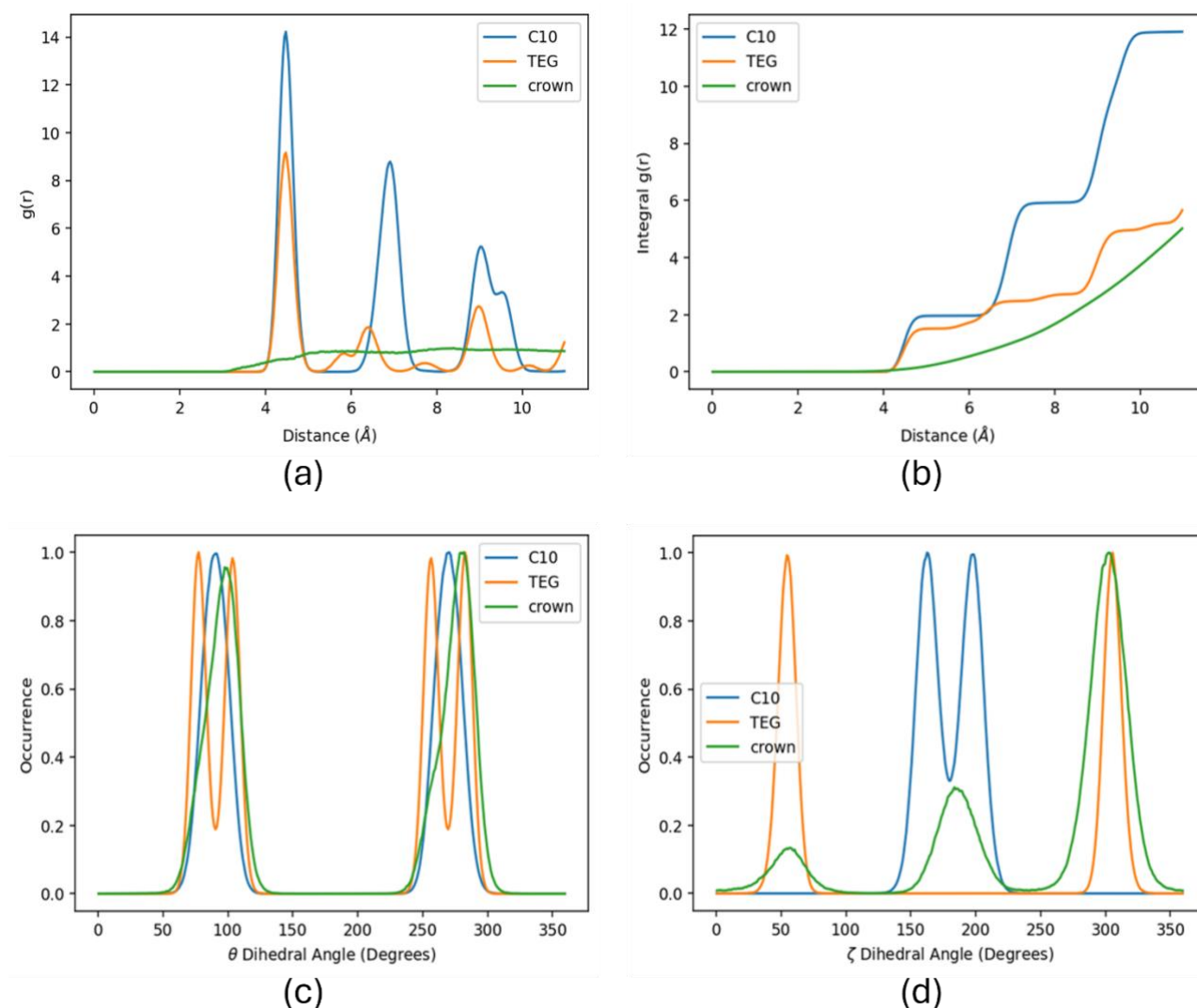


Figure 7. Comparative analyses of the simulated **NDI-C10** (blue data), **NDI-TEG** (orange data) and **NDI-crown** (green data) morphologies. Panel a): RDF between nitrogen atoms. Panel b): integral of the RDF, namely the coordination number. Panel c) and d): θ and ζ angle DDF.

From the comparison of the RDFs (**Figure 7a**) clearly emerges the amorphous nature of **NDI-crown** compared to the crystalline structural order of **NDI-C10** and **NDI-TEG**. For both **NDI-C10** and **NDI-TEG** the principal peak is located at the same distance (4.48 \AA), thus reflecting similar nearest neighbour proximity between the NDI moieties for such two species. **NDI-C10** shows sharper and more intense peaks than **NDI-TEG**, indicating tighter molecular packing and reduced influence of thermal disorder. In contrast, the broad and weak features of **NDI-crown**

confirm its amorphous morphology. The amorphous **NDI-crown**, unlike the other two crystals, presents a tail of the radial distribution function which extends to lower distances than **NDI-C10** and **NDI-TEG**. The structures contributing to such tail are represented by dimer-like aggregates where the intermolecular distance between the NDI cores are lower than 4 Å, corresponding to roughly 7-8% of the molecules in the simulation box. Such aspect is quite remarkable because, despite the limited number of molecules featuring the close packed structure, it shows that a structurally hindered species like the **NDI-crown** can still lead to intermolecular distances which are even lower than those obtained by linear side chains, like C10 and TEG. The integral of the RDF (**Figure 7b**) shows a dimer-like interaction up to 6 Å for **NDI-C10** and **NDI-TEG**. The integral of the RDF shows also that **NDI-C10** is the closest packed structure throughout the whole simulation box. Interestingly, each molecule of **NDI-TEG** and **NDI-crown** has the same number of neighbouring molecules in a radius of 10 Å, despite the differences in the chemical structure and short-range morphology.

The equilibrium value of the θ angle (**Figure 7c**), governing the position of the side group, falls in the same region however it presents some differences for the three species. Most notably, due to the symmetry of the crystal cell, **NDI-TEG** shows four peaks, while **NDI-C10** and **NDI-crown** show only two. In **NDI-TEG** the θ angle is stiffer compared to the two other species, as reflected by the full width at half height of the peaks being 12-14°, while for **NDI-C10** and **NDI-crown** it ranges from 25° to 30°. This aspect might reflect larger thermal disorder effects for **NDI-C10** and **NDI-crown** than for **NDI-TEG**. On the other hand, the ζ angle (**Figure 7d**) highlights the difference between morphologies. For crystalline **NDI-C10** and **NDI-TEG** the peaks are centred around the experimental values and the effect of thermal disorder is comparable to the θ angle case. For **NDI-crown**, on the other hand, the ζ angle shows the morphological versatility of the amorphous phase. The three peaks are centred at 56°, 183° and 302° and the thermal effects are higher with respect to those affecting the θ angle, proving a wider exploration of the phase space.

The above structural analyses provide some understanding about the overall conformational versatility, however they can not give insights into the inner dynamics and time-scales, reflecting possible time-dependent structural relaxations. To include dynamical information, we investigated some inner structural changes via a time-dependent correlation function largely used in the analysis of liquid (disordered) systems, showing how fast the memory of a molecular orientation is lost^{77,78} The latter is the time required for the molecules to lose their initial configuration, called reorientation time. (see ESI for details about the computation of the correlation function). For **NDI-C10** and **NDI-TEG** we witness a hindered rotational dynamics (i.e., constant correlation function), typical of rigid crystal structures (Figure S13, ESI). Interestingly, for **NDI-crown** both the rotational dynamics of the naphthalene cores and of the crown motifs are partially allowed, so the reorientation correlation function rapidly decays in the first 5 ns, however maintaining a high value (>0.90) still after 30 ns dynamics. Full reorientation, if any, might occur however on a timescale much longer than our capable computing time, suggesting a rigid, glassy-like state.⁷⁹

Overall, the amorphous **NDI-crown** shows richer conformational versatility with respect to the crystalline **NDI-C10** and **NDI-TEG** counterparts. This versatility, however, could be related to the simulated deposition process, which produces a (meta)stable state in which the internal dynamics are hindered.

Conclusion

In this work, we performed extended molecular dynamics (MD) simulations on three NDI species, namely the well-known **NDI-C10** (functionalized with *n*-decyl side chains), as reference compound, and two newly synthesized NDIs, the latter potential candidates as OMIECs: **NDI-TEG** (with linear triethylene glycol side chains) and **NDI-crown** (with cyclic 15-crown-5 motifs). The three species have been synthesized and experimentally characterized. **NDI-C10** and **NDI-TEG** result in crystalline forms at room temperature, while **NDI-crown** appears amorphous at solid state. To get quantitative insights into the structural order at the molecular scale, we performed MD simulations by carefully re-parameterizing the non-bonded parameters of the force field. Such approach results in a remarkable match between simulated and experimental single-crystal data for **NDI-C10** and **NDI-TEG**, leading to an overestimation of only 1-2% in the MD computed mass density and crystal cell parameters.

At room-temperature, **NDI-C10** single-crystal shows a lamellar stacking motif with close packed NDI cores, and perpendicular side chains showing an all-*trans* conformation. Thermal disorder does not trigger significant sliding or rotations of the NDI cores, nor does it introduce *gauche*-like conformations within the side chains, as confirmed by a high nematic global order parameter ($Q > 0.99$).

NDI-TEG, instead, forms a columnar arrangement in which neighbouring cores along the *c* axis adopt opposite orientations. The triethylene glycol side chains are normal to the NDI unit, however they show a mixed *gauche-trans* conformation, similarly to other semiconducting small molecules for *p*-type organic electrochemical transistors.²⁹ This unique chain conformation allows for a dense molecular packing, without forming lamellar layers. Thermal fluctuations slightly broaden the dihedral angle distributions, however the overall structure is kept, as reflected by high *Q* values (> 0.98).

Replicating the experimental conditions, our MD simulations were able to predict the solid-state morphology of **NDI-crown**, which was found to be amorphous. Accordingly, *Q* is close to zero. Despite a disordered bulk, **NDI-crown** shows some short-range structural order. We characterized the order by introducing a spatial correlation function, previously considered in the field of correlated complex systems, finding that on a short-range **NDI-crown** self organizes in local aggregates (e.g., dimers, trimers), with packing motifs that range from π - π , edge-on or tilted stacking.

Finally, time-dependent orientational auto-correlation functions revealed the high structural stiffness of each species, however showing a higher rotational degrees of freedom for **NDI-**

crowns than for **NDI-C10** and **NDI-TEG**. Such feature suggests the existence of possible metastable (glassy-like) states, otherwise impossible to capture with standard MD simulation techniques, suggesting the use of advanced enhanced sampling methods for their investigation.⁸⁰

Our joint experimental and computational investigation shows that linear and crown glycol side chains, can have a profound impact on the bulk morphology of the NDIs. The first leads to highly crystalline materials with hindered internal dynamics, while the second results in amorphous films showing a local degree of molecular ordering and correlation dynamics. Such structure-dynamic property may pave the way for further systematic analysis aiming at designing guidelines for electronic and ionic transport properties in small-molecule conductors.

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