

# Prediction and Theoretical Characterization of *p*-Type Organic Semiconductor Crystals for Field-Effect Transistor Applications

Şule Atahan-Evrenk and Alán Aspuru-Guzik

**Abstract** The theoretical prediction and characterization of the solid-state structure of organic semiconductors has tremendous potential for the discovery of new high performance materials. To date, the theoretical analysis mostly relied on the availability of crystal structures obtained through X-ray diffraction. However, the theoretical prediction of the crystal structures of organic semiconductor molecules remains a challenge. This review highlights some of the recent advances in the determination of structure–property relationships of the known organic semiconductor single-crystals and summarizes a few available studies on the prediction of the crystal structures of *p*-type organic semiconductors for transistor applications.

**Keywords** Charge transfer integral · Charge transport · Crystal structure · Crystal structure prediction · Mobility · Organic field-effect transistors · Organic semiconductors

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Ş. Atahan-Evrenk (✉)  
Department of Chemistry and Chemical Biology, Harvard University, 12 Oxford Street,  
Cambridge, MA 02138, USA

TOBB-ETU Medical School, Sogutozu Cad. No: 43, Sogutozu, Ankara 06560, Turkey  
e-mail: [atahan@fas.harvard.edu](mailto:atahan@fas.harvard.edu)

A. Aspuru-Guzik  
Department of Chemistry and Chemical Biology, Harvard University, 12 Oxford Street,  
Cambridge, MA 02138, USA

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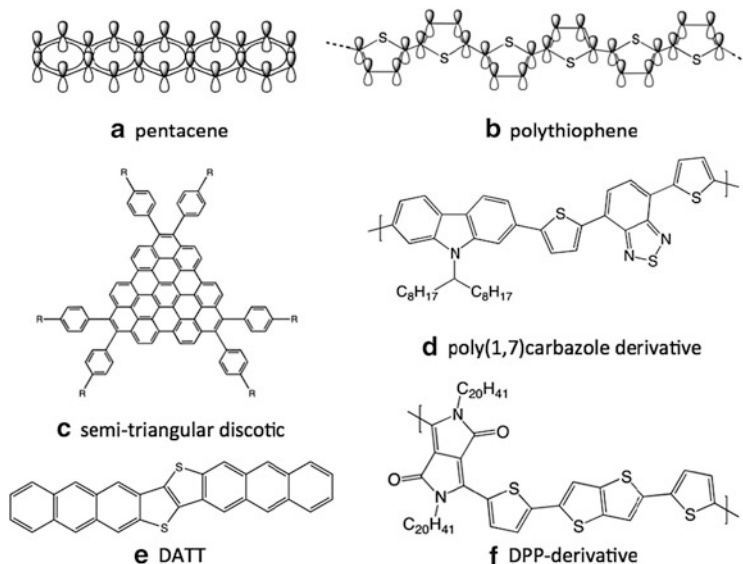
## Abbreviations

BTBT	[1]Benzothieno[3,2- <i>b</i> ][1]benzothiophene
BTBT-C <sub>8</sub>	2,7-Dioctyl[1]benzothieno[3,2- <i>b</i> ][1]benzothiophene
DATT	Dianthra[2,3- <i>b</i> :2',3'- <i>f</i> ]thieno[3,2- <i>b</i> ]thiophene
DMA	Distributed multipole analysis
DNTT	Dinaphtha[2,3- <i>b</i> :2',3'- <i>f</i> ]thieno[3,2- <i>b</i> ]thiophene
DPP	Diketo-pyrrolo-pyrrole
DPP(TBFu) <sub>2</sub>	3,6-Bis(5-(benzofuran-2-yl)thiophen-2-yl)-2,5-bis(2-ethylhexyl)pyrrolo[3,4- <i>c</i> ]pyrrole-1,4-dione
DTT-Ph-C(8,12)	2,6-Bis(4-(octyl,dodecyl)phenyl)-dithieno[3,2- <i>b</i> :2',3'- <i>d</i> ]thiophene
GA	Genetic algorithms
ISC	Inorganic semiconductor
OSC	Organic semiconductor
PDIF-CN <sub>2</sub>	<i>N,N'</i> -1 <i>H</i> ,1 <i>H</i> -Perfluorobutyldicyanoperylene-carboxydi-imide
Rubrene	5,6,11,12-Tetraphenyltetracene
TbTH	Tetraceno[2,3- <i>b</i> ]thiophene
TcTH	Tetraceno[2,3- <i>c</i> ]thiophene
Tips-pentacene	6,13-Bis(triisopropylsilylethynyl)pentacene
TMTSF	Tetramethyltetraselenafulvalene

## 1 Introduction

Organic compounds with  $\pi$ -electron systems show interesting functionality such as conductivity and semiconductivity [1]. Thanks to their extended  $\pi$ -conjugation, organic semiconductors (OSCs) have delocalized orbitals where charge carriers can move. If the charge carriers are produced extrinsically by injection from electrodes or by the photoelectric effect, electrons or holes can find pathways to go from molecule to molecule or over a conjugated backbone of a polymer (Fig. 1a, b) Thus OSCs have great potential to be used as components in electronics or in solar cells. Especially in inexpensive, flexible, and large area applications such as radio frequency ID tags, chemical/pressure sensors, display drivers, and solar cells [8–11], they have the potential to be an alternative to silicon-based semiconductors.

A notable advantage of OSCs is their design potential. The versatility of carbon provides a vast chemical space which can be explored with *in silico* strategies. For example, in the Harvard Clean Energy project database, there are 2.6 million theoretical candidate OSC compounds combinatorially designed from 30 molecular fragments as potential semiconductor materials for solar cell applications



**Fig. 1** Examples of molecular and polymer organic semiconductors. The references for the molecules: (a) [2], (b) [3], (c) [4], (d) [5], (e) [6], (f) [7]

[12–14]. In this vast compound space, theoretical modeling and prediction have the potential to guide the synthesis of new OSCs thus reducing the high cost of finding materials by trial and error.

In recent years, increasing numbers of new OSCs have been designed and improved through computational modeling. For example, the modification of liquid crystal molecules (Fig. 1c) to enhance columnar organization and optimize intermolecular couplings for enhanced charge transport [4] or the design of polycarbazole derivative donor polymers (Fig. 1d) for organic photovoltaic applications by first-principles screening of the prototypical oligomers [5] proved useful. The synthesis of a new high performance molecular material [6] (Fig. 1e) or diketopyrrolopyrrole (DPP)-based polymers (Fig. 1f) with the help of computational modeling are demonstrated [7]. Despite the common limitations of current theoretical studies based on approximate methods such as density functional theory (DFT), these studies, where theory guided the synthesis of high performance materials, are promising. Now we are just opening a door into a new era where quantum chemistry methods are integrated into material science and engineering problems for more intelligent search of better OSC materials [12, 13, 15–19].

The successful prediction and computational design of high performance OSCs will be possible if three main objectives are achieved. First, a detailed understanding of the structure–property relationship for known OSCs is crucial. The main goal is to know what works, why it works, and how the material properties could be further optimized. Second is the ability to predict the solid-state structure from the molecular structure. This requires the generation of all possible crystal structures

and computation of the lattice energies to rank and identify the lowest energy polymorphs. Third is the efficient computational simulation of charge transport to evaluate the crystal structures and identify the best semiconductors for particular applications. In this review we address the first and second objectives and briefly discuss the third.

With an ever-growing number of publications in OSC synthesis, design, and analysis [20, 21], there is now a substantial body of knowledge on the structure–property relationships for the OSCs in transistor applications. Undoubtedly, X-ray diffraction and analysis plays a crucial role in the elucidation of the structures and the derivation of the structure–property relationships experimentally [22]. In addition, theoretical characterization with molecular dynamics, quantum chemistry, especially density functional theory, and charge transport models, helped to derive important structure–property relationships in OSCs [16, 17, 23–25]. We will discuss some of the derived relationships in Sect. 2.

The crystal structure prediction for OSCs, on the other hand, remains mostly unexploited, not only because of the computational challenges but also, we believe, due to the lack of commercial applications that requires immediate attention to possible polymorphs and the structural factors affecting the device performance. One of the most important motivations for the crystal structure prediction for organic molecular solids is the polymorphism in solid forms of drug molecules [26]. For example, an unpredicted lower energy polymorph of the HIV drug Ritonavir [27], which manifested itself during the manufacturing and storage, not only was inactive as a drug but could also act as a seed to convert the active form into the inactive form on contact. In OSCs, interconversion between polymorphs may lead to loss of the desired electrical properties. Thus, we believe in the very near future, as more commercial applications of OSCs appear in the electronics market, the crystal structure prediction of OSCs will gain impetus.

There are various factors that complicate crystal structure prediction for OSCs. As shown in Fig. 1, most OSC molecules are large and flat with quasi-rigid conjugated backbones. Like other organic molecular crystals, they have many polymorphs with similar lattice energies. For example, there is less than 1 kcal/mol difference between C and H polymorphs of pentacene [28]. On one hand, it is advantageous to have a relatively simple molecular structure with higher symmetry that leads to mostly two-dimensional packing. This simplifies the search problem, that is the effective construction of likely packing configurations. On the other hand, phase transitions from one polymorph to another are more likely in these two-dimensional packing patterns. The energy barriers among different polymorphs are not as high as in organic crystals which pack in three-dimensional patterns, where the molecules are locked in place due to a lock and key kind of close-contacts. Therefore, in OSCs, as temperature fluctuates, transitions from one polymorph to another are more likely, sometimes yielding mobility differences as high as an order of magnitude as temperature increases [29]. In addition, solution processible materials usually have long alkyl chains as solubilizing groups [30], with many conformers, increasing the size of the search space dramatically.

With the exception of a few hydrogen bonding OSCs [31, 32], most OSC solids are held together by van der Waals forces, mostly London dispersion forces. These forces are quantum mechanical in nature and hard to capture in classical models such as molecular mechanics, which always treat the van der Waals forces as two body interactions. The transferability of the force field parameters is also an issue [33]. Due to the size of the crystalline systems, the conventional high-accuracy correlated wave function methods are too expensive. Therefore, density functional theory (DFT) methods are widely used. However, conventional DFT approximations cannot describe the attractive van der Waals forces (long-range dispersion) accurately [34]. For example, to rank the lattice energies of polymorphs of a relatively small molecular system such as para-diiodobenzene, DFT falls short, and computationally demanding methods such as diffusion quantum Monte Carlo is necessary [35]. Fortunately, the dispersion corrected DFT methods have now developed to such an extent that many body dispersion interactions can be included in the interaction potentials and can be used to calculate the lattice energies with chemical accuracy [36]. For example, many-body dispersion-corrected DFT has been shown to achieve chemical accuracy for the prediction of the sublimation enthalpies for a set of compounds ranging from pure hydrogen bonding molecules to only van der Waals bonded solids as well as compounds that uses both types of bonding in the solid state [36]. This is an exciting development yet it needs to be put to work for OSC crystal prediction. The practical use of DFT with dispersion to predict small molecular crystals has also been vetted in the last crystal structure blind test organized by Cambridge Structural Database [37].

Blind tests organized by Cambridge Structural Database provides an invaluable opportunity for the test of the predictive power of the state-of-the-art methodologies for crystal structure prediction. In the last blind tests, significant progress towards the prediction of crystal structures of molecular crystals was achieved [37, 38]. The most successful approaches included extensive initial structure searches to span all possible space groups, primary refinement of the initial structures by the tailor-made force fields [39], treatment of the internal degrees of freedom for the flexible molecules correctly [40], and refinement of the lattice energies with dispersion corrected DFT methods [41] or distributed multipole analysis approaches [42]. In the last blind test, from the perspective of the organic semiconductor prediction, especially important was the successful prediction of a compound with large internal flexibility. Two participating groups predicted the crystal structure of the largest (33 heavy atoms) and most flexible (8 rotatable bonds) molecule and reported the right polymorph as their top ranking choice. The positive implication of this success for the prediction of the crystal structures of OSCs is obvious as most of them are large and include solubilizing alkyl chains with many rotatable bonds.

Another challenge in the computational OSC design is the difficulty of testing the theories and structure predictions by comparison with experimental data. The main reason is the multitude of experimental factors affecting the solid-state structures and ensuing device performance. The nanoscale order, for example, is highly dependent on processing factors such as temperature, pressure, type of solvent, impurities, or substrate surface [15]. Small changes in these factors have

the potential to affect the experimental outcome drastically. The inclusion of all of these factors into the computer simulations is an important unsolved challenge for the theoretical community. We should also note that theoretical studies usually focus on single crystals, leaving out the polycrystalline materials which unfortunately constitute most of the reported compounds in the literature.

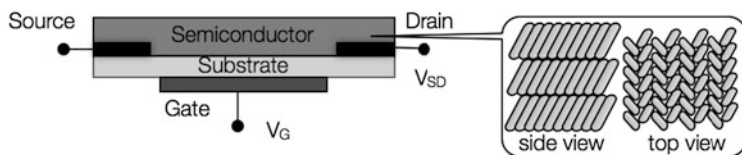
The charge transport processes in OSCs is another hard problem to model. To achieve de novo modeling, one needs general models where different regimes of transport are addressed accurately and efficiently so that libraries of molecules and their solid-state structures can be analyzed to identify the most promising ones. However, in principle, the movement of charge carriers in OSCs requires a many-body quantum mechanical treatment [43]. Since an exact solution is not possible, a number of approximate approaches are adapted such as the density matrix propagation, master equation approaches, dynamical mean-field theory, and so forth. The studies showed that the coupling of the motion of the charge carrier to the molecular and crystal degrees of freedom is crucial to describe the problem accurately and a self-consistent solution of the whole Hamiltonian is necessary [25]. The modeling of charge transport in OSCs is still a developing field and the structural parameters obtained from ab initio quantum chemistry are playing an important role in the development of more realistic models [23–25, 44, 45]. In addition, a comprehensive multi-scale approach also needs to address issues emerging from organic field-effect transistor (OFET) device configurations such as the contact resistance, and short and long-range effects of the gate dielectric, among others.

Thus, in this rapidly advancing field of OSC design, the theoretical characterization and prediction has tremendous potential for growth. Successful routine prediction and screening approaches may make themselves more useful in the future. Before moving on to the theoretical characterization and prediction techniques, in the rest of the introduction we briefly summarize the working principles of an OFET and the important structural parameters of charge transport for an ideal OSC for transistor applications.

## ***1.1 The Organic Field-Effect Transistor***

The transistor is the most important single element in an electronic circuit. For organic electronics to find viable commercial applications, a fast, reliable, and inexpensive OFET is crucial [46]. We have come a long way since the first organic transistors in the 1980s [3, 47]. Especially in the last 10 years there has been a great progress in the discovery of new OSCs and the optimization of the process conditions to achieve commercial viability [3, 21]. Today, some organic semiconductor materials surpass amorphous silicon in performance [48] and there are commercial applications of organic transistors in printed electronics [49], displays, and microelectronics [9].

An OFET is a voltage-controlled switch where an external voltage applied between the electrodes creates a current through an OSC layer. Then the flow of



**Fig. 2** Schematic of an OFET structure (*left*) and example of herringbone-type molecular packing in the OSC (*right*)

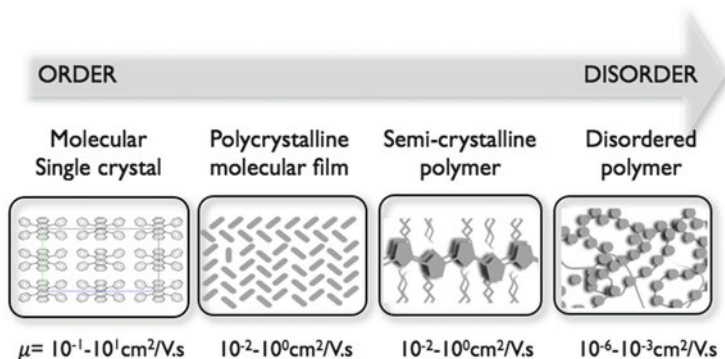
current is modulated by a gate voltage applied through the dielectric substrate [50, 51]. In a typical bottom-contact *p*-type OFET, an OSC crystal or a thin film is placed over a dielectric substrate (usually  $\text{SiO}_2$ ) in contact with the source and the drain electrodes (Fig. 2). The negative bias gate voltage applied through the dielectric induces charge carriers (holes), creating a channel between the source and the drain electrodes. Current flows through the channel when a drain bias is applied.

In *p*-type materials the holes are the charge carriers. Therefore charge injection into the highest occupied molecular orbital (HOMO) of the OSC requires that the work function of the metal electrodes should match the HOMO energy level of the OSC. The source and drain electrodes are usually chosen from low work function noble metals such as gold (Au work function: 5.1 eV). The dielectric layer separating the gate from the semiconductor could be a  $\text{Si}/\text{SiO}_2$  layer preferentially treated with a hydrophobic self-assembled monolayer of alkylsilanes to promote molecular order and enhance transport [52].

The most important parameters defining the transistor performance are the mobility and drain-source current ratio when the gate voltage switches on and off,  $I_{\text{on/off}}$  [50]. The mobility characterizes the mean drift velocity of the charge carrier when an electric field is applied and it is derived from the current–voltage curves of the transistor. The higher the mobility and  $I_{\text{on/off}}$ , the better the transistor performance. For example, in a liquid display,  $I_{\text{on/off}}$  of  $10^6$  and a minimum mobility of  $0.1 \text{ cm}^2 \text{ V}^{-1} \text{ s}^{-1}$  are needed for good performance [50]. Another important factor which affects the performance is the operating voltage of the transistor. Traditionally, the operating voltages in OFETs could be as high as 100 V. Low operating voltages is a requirement for practical applications and has been demonstrated by the use of high capacitance dielectric layers [53, 54].

OFET devices are very complex since many factors affect their performance, such as the grain size and boundaries, substrate, substrate temperature, or contact resistance. In this review we only focus on the molecular and crystal structural factors affecting the charge transport ability of the OSC layer. Specifically, we consider the single-crystal layers because they provide a more consistent platform to study the structural effects [55].

Since charge carrier transport depends strongly on the  $\pi$ -orbital interactions, the molecular level ordering has important consequences for OSCs. Figure 3 schematically illustrates the correlation of the mobility to molecular level ordering for a set of materials from perfect single-crystals to disordered polymers. It is established



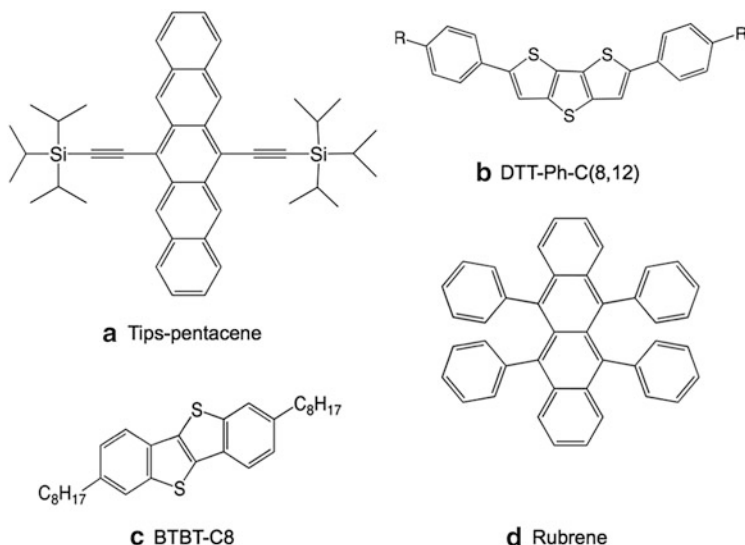
**Fig. 3** OFET mobility correlates with structural order. As the order of the material decreases, in a progression from single molecular crystals to disordered polymers, carrier transport decreases by orders of magnitude

now that usually the better the molecular organization of an OSC, the higher the material performance. Surpassing amorphous silicon, the single crystalline OSCs have mobilities in the range of  $0.1-40 \text{ cm}^2 \text{ V}^{-1} \text{ s}^{-1}$  whereas in polycrystalline and disordered films the mobilities fall down to the range of  $0.0001-0.1 \text{ cm}^2 \text{ V}^{-1} \text{ s}^{-1}$  [46]. In polycrystalline films the grain boundaries become traps for charge carriers, thus reducing the performance considerably. The anisotropy in the mobilities due to the low symmetry of the molecules compared to inorganic semiconductors, for example, also underlines the importance of the packing patterns and microscopic order in OSCs.

Despite the success of crystalline small molecule OFETs, the commercialization of these devices has been limited due to their low solubility. Usually, to make single-crystal OFETs, micron-to-millimeter-size crystals are obtained by vacuum deposition and later handpicked to be aligned along the appropriate direction between the electrodes. This is not a yet practical option for commercialization. The large-scale semiconductor coating production similar to printing requires solution processable materials. To achieve solubility, molecular units are usually modified through the addition of aliphatic groups such as long alkyl chains. Although these additions/modifications sometimes increase the performance due to the close-packing of the conjugated backbones enforced by the lipophilic interactions of the alkyl chains [31], the grain boundaries reduce the mobility to the range of  $0.01-1 \text{ cm}^2 \text{ V}^{-1} \text{ s}^{-1}$ .

Recently, however, there has been important progress regarding the development of solution-processable and high-performance OSCs. For example, with controlled deposition of tips-pentacene films (Fig. 4a) with solution-shearing through nanoarray surfaces, a mobility of  $11 \text{ cm}^2 \text{ V}^{-1} \text{ s}^{-1}$  has been demonstrated by Diao et al. [59]. Also in microsheets and microribbons of dithieno[3,2-*b*:2',3'-*d*] thiophene derivatives (Fig. 4b) a mobility of  $10 \text{ cm}^2 \text{ V}^{-1} \text{ s}^{-1}$  and above is observed [57]. Moreover, a record average high mobility of  $16.4 \text{ cm}^2 \text{ V}^{-1} \text{ s}^{-1}$  was observed in the single crystals of C<sub>8</sub>-BTBT (Fig. 4c) deposited in an ink-jet printer [156].





**Fig. 4** Examples of high-performance OSCs. The references for the molecules: (a) [56], (b) [57], (c) [157], (d) [58]

Semiconducting polymers, on the other hand, naturally have the advantages of solution processability, thermal stability, and film uniformity [60]. The polymers usually form semi-crystalline films with lower mobilities as seen in Fig. 3. Compared to the first polymer-based OFET (polythiophene, Fig. 1b) fabricated in 1986 [3], the progress has been remarkable. For example, DPP-based polymers (Fig. 1f) with a record high mobility of  $10 \text{ cm}^2 \text{ V}^{-1} \text{ s}^{-1}$  were reported recently [61]. Such high mobility for a semicrystalline polymer is very unusual due to the presence of the disorder in these systems. Recent investigations revealed that a certain degree of polymerization is necessary for the high mobility since the polymeric chains connecting crystalline domains can act as bridges for charge transport [62]. Since the structure prediction for polymers is outside the scope of this review, we will not discuss polymer-based OFETs any further. However, we would like to underline the notion that once a good molecular or polymeric material is discovered, through the optimization of the processing conditions it is possible to engineer high-performance materials. This might entail the enhancement of the intermolecular orbital interactions or the reduction of the impurities or other structural traps.

Despite the remarkable progress made in the synthesis and process engineering in OFETs [15], up until now theoretical characterization and prediction has relied on the availability of crystal structures from X-ray diffraction analysis [22]. Once the structure of an OSC is known, the structural parameters affecting the performance are examined through theoretical characterization techniques. The structure–property relationships learned from the study of known OSCs provide a framework upon which new novel materials discovery routes rely. We dedicate the

rest of this section to the important parameters in OFET modeling and Sect. 2 to the structure–property relationships.

## 1.2 Charge Transport Models and Parameters

In contrast to the success of charge transport models for inorganic semiconductors (ISC), models for OSCs are still under development. The major reason for this lack of a comprehensive model is the difficulty of dealing with molecular behavior in the solid state. Unlike in an ISC, the OSC building blocks have high polarizability, low internal symmetry, and weak intermolecular interactions. In addition, the diversity of materials from molecules to polymers and to liquid crystals poses challenges for the development of generalized and consistent models.

To summarize the basic understanding of the charge transport mechanisms and underlying structural factors, it is useful to start with a Hamiltonian for a single particle moving on a periodic lattice. The following Hamiltonian [63] includes all the important energy contributions describing the motion of a charge carrier over regular lattice sites,  $i$  and  $j$ :

$$\begin{aligned}
 \mathbf{H} &= \mathbf{H}_{\text{el}}^0 + \mathbf{H}_{\text{ph}}^0 + \mathbf{H}_{\text{el-ph}}^{\text{local}} + \mathbf{H}_{\text{el-ph}}^{\text{non-local}}, \\
 \mathbf{H}_{\text{el}}^0 &= \sum_j \epsilon_j a_j^\dagger + \sum_{i \neq j} J_{ij} a_i^\dagger a_j, \\
 \mathbf{H}_{\text{ph}}^0 &= \sum_{\mathbf{q}} \hbar \omega_{\mathbf{q}} \left( b_{\mathbf{q}}^\dagger b_{\mathbf{q}} + \frac{1}{2} \right), \\
 \mathbf{H}_{\text{el-ph}}^{\text{local}} &= \sum_{\mathbf{q}} \sum_j \hbar \omega_{\mathbf{q}} g_{jj, \mathbf{q}} \left( b_{\mathbf{q}}^\dagger b_{-\mathbf{q}} \right) a_j^\dagger a_j, \\
 \mathbf{H}_{\text{el-ph}}^{\text{non-local}} &= \sum_{\mathbf{q}} \sum_{i \neq j} \hbar \omega_{\mathbf{q}} g_{ij, \mathbf{q}} \left( b_{\mathbf{q}}^\dagger + b_{-\mathbf{q}} \right) a_i^\dagger a_j.
 \end{aligned} \tag{1}$$

Here,  $\mathbf{H}_{\text{el}}^0$  is the electronic Hamiltonian,  $a^\dagger$  and  $a$  are the creation and annihilation operators,  $i$  and  $j$  label the molecular sites with energy  $\epsilon$ , and  $J$  is the charge transfer integral which represents the strength of electronic coupling among neighboring sites.  $\mathbf{H}_{\text{ph}}^0$  represents the phonon contributions with frequency  $\omega$  where  $\mathbf{q}$  and is the wavevector. The operators  $b_{\mathbf{q}}^\dagger$  and  $b_{\mathbf{q}}$  denote the creation and annihilation operators for the phonons with energy  $\hbar \omega_{\mathbf{q}}$ . As can be seen in (1), the electron–phonon coupling term has local ( $g_{ii}$ ) and non-local ( $g_{ij}$ ) contributions. Within this formulation, the local electron–phonon coupling term modulates the site energies whereas the non-local coupling modulates the site-to-site interaction terms  $J_{ij}$ . As a first-order approximation, the local and the non-local electron–phonon coupling terms could be obtained by Taylor expansion of the electronic Hamiltonian along the phonon modes [64].

Depending on the relative strength of the terms of this Hamiltonian, the models could be roughly categorized into band, polaron, and disorder models [63]. In the band transport models,  $J$  is the most important term. Due to strong coupling among the sites, the bandwidth is relatively large, and thus a mobility value above  $10 \text{ cm}^2 \text{ V}^{-1} \text{ s}^{-1}$  is possible. However, in OSCs, since the molecular interactions are weak, injection of a charge polarizes the molecule and its surroundings significantly, leading to formation of a polaron. The polaron is a quasi-particle representing the charge and the polarized lattice around it [43]. Thus in these models the electron–phonon coupling terms play a crucial role and determine the transport characteristics and the temperature dependence in the mobility. In the case of disorder-based models, the fluctuations of the site energies and the modulation of the coupling terms are so large that the charge transfer can be described as a series of uncorrelated hops in a broad density of states [63].

Temperature plays a crucial role in the charge transport in OSCs. It has been demonstrated for pentacene (Fig. 1a) [65] and rubrene (Fig. 4d) [58], for example, that, at low temperatures up to 280 K, the mobility shows an inverse dependence on temperature ( $T^{-n}$ ) which is the evidence of band transport. The mobility decreases with increasing temperature as more and more scattering of the charge carriers happens due to the phonon modes of the medium. Somewhere around room temperature (280–300 K), the charges carriers localize to the molecular sites due to thermal fluctuations and the transition to activated hopping occurs so that the mobility increases as a function of increasing temperature [66].

Thus, naturally, the choice of the most appropriate model depends on the knowledge of the molecular and solid-state structure. Once the structure is known, ab initio molecular [25, 67] or solid-state electronic structure parameters [68] can be used to make more realistic models based on multi-scale QM/MM or semiclassical schemes [23, 24, 44, 69]. In the following sections we briefly discuss these important parameters for the charge transport models.

### 1.2.1 Electronic Coupling, $J$

The electronic coupling term,  $J$ , is one of the important structural parameters determining the charge transport properties of an OCS. In the literature, another more common name for the electronic coupling term is the charge transfer integral, or transfer integral.

For *p*-type OSCs, in a simple dimer approach, the transfer integral can be calculated as the electronic coupling of the HOMO orbitals of adjacent molecules as  $J = \langle \psi_A^{\text{HOMO}} | H_{\text{el}} | \psi_B^{\text{HOMO}} \rangle$ , where the  $A$  and  $B$  indexes represent the adjacent molecules in a relative geometry extracted from the crystal structure. For symmetrically equivalent molecules, it is simply the splitting of the HOMO molecular orbitals in the dimer configuration. In the case of geometrically non-equivalent molecules, however, the effect of the site energy differences should be taken into account [70–72]. This dimer-based approximation neglects the effect of the crystal

environment on the transfer integrals. It is also possible to calculate the transfer integrals from fitting the dispersion of the bands into a tight-binding Hamiltonian [44, 73, 74]. This approach includes the crystal environment effects within the level of the theory used. Experimentally, the transfer integral values can be obtained from the dispersion of the HOMO bands determined by photoemission spectroscopy [68].

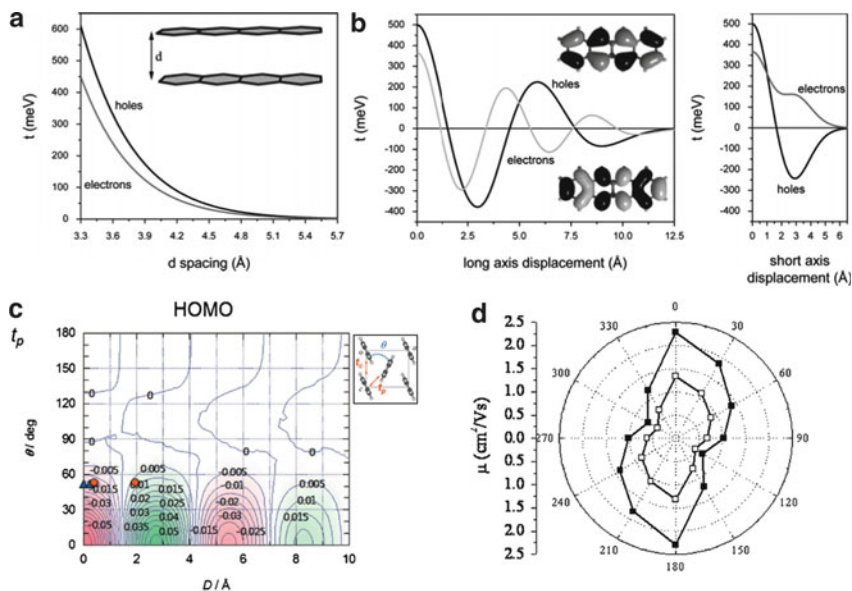
In the calculation of transfer integrals, DFT-based methods are usually employed as they provide a good enough accuracy with a reasonable cost. For a medium size molecule such as pentacene, hybrid functionals with double-zeta basis with polarization functions are usually used and shown to provide qualitatively accurate results [75]. For larger molecules, long-range corrected DFT methods provide better accuracy [76]. It has also been shown within the dimer-based approach that the change in the transfer integrals associated with the applied electric field is negligible [77].

The electronic coupling terms show the following characteristic features:

1. Exponentially decreasing as a function of increasing intermolecular distance. The smaller the intermolecular stacking distances, the stronger the molecular orbital couplings for configurations for which the transfer integral is not zero.
2. Oscillatory behavior as a function of molecular displacements in the direction perpendicular to the interaction of  $\pi$ -orbitals. The oscillation as a function of the slip along the long axis is called the  $D$ -modulation.
3. Dihedral angle dependence [78].
4. Anisotropy [79].

As can be seen in Fig. 5a–c, the transfer integral strength strongly depends on the dimer geometry of the interacting molecules [25, 64]. The dependence on the  $\pi$ -stacking distance is exponential (Fig. 5a) [25], and thus it is crucial to be able to control it. Slip-stacked geometries as a function of short and long axes show oscillations. Kojima and Mori analyzed the dihedral angle dependence of transfer integrals for a group of molecular OSCs with typical herringbone packing [78]. As expected, all these molecules show the characteristic oscillation behavior as a function of dihedral angle and  $D$ -modulation. They observed that the transfer integral strength is strongly dependent on the molecular orbital symmetry as well as the crystal structure packing. Due to the oscillatory nature of the transfer integrals as a function of geometrical orientation of the molecules, achieving charge transport through the optimization of the couplings is challenging.

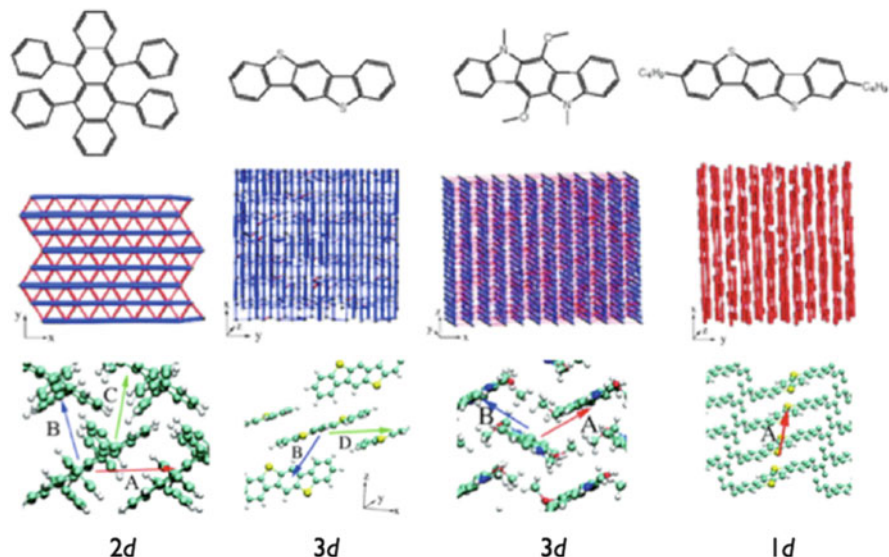
The strength and the extent of  $J$  determine (an)isotropy of the mobility and the bandwidth. As shown in Fig. 5d for pentacene, moderate to strong anisotropy of mobility tensor is a common feature of the transport plane. The bandwidth is also strongly dependent on the transfer integral values. For example, within the tight-binding approximation, the bandwidth for a one-dimensional network of coupled sites is defined as  $4J$  [80, 81]. For a two-dimensional OSC, direct relationships between the transfer integrals and the bandwidth are established [82, 83]. The percolation network's robustness, fragility, and dimensionality depend on the strength of the transfer integrals between the molecules in each direction.



**Fig. 5** (a, b) The dependence of the transfer integral on the intermolecular  $\pi$ -stacking distance in tetracene [25],  $D$ -modulation in tetracene [25]. (Reprinted with permission from [25]. Copyright (2007) American Chemical Society). (c) Dihedral angle dependence in pentacene [78]. (Reprinted with permission from [78]. Copyright (2011) The Chemical Society of Japan). (d) Anisotropy of the mobility of pentacene in the transport plane (*filled squares*: maximum mobility, *empty squares*:  $-10$  V gate voltage). (Reprinted with permission from [79]. Copyright (2006) AIP Publishing LLC)

Depending on the packing patterns and the ensuing  $\pi$ -orbital overlap, one-, two-, or sometimes even three-dimensional conductance is possible. For example, Vehoff et al. analyzed the topological connectivity of four different single crystals, namely rubrene, benzo[1,2-*b*:4,5-*b'*]bis[*b*]benzothiophene derivatives with and without  $C_4H_9$  side chains and indolo[2,3-*b*]carbazole with  $CH_3$  side chains [84] (see Fig. 6). The transfer integrals for the adjacent molecules revealed the dimensionality of the percolation networks as illustrated in Fig. 6.

These observations pertaining to the nature of the transfer integral only include the geometries of the equilibrium structures. At finite temperature, since these materials are weakly bound van der Waals solids, the thermal motion of the molecules significantly affect (modulate) the transfer integrals. Instead of a single equilibrium value, a probability distribution of transfer integral values appears. The shape of the distribution strongly depends on the temperature. This modulation could naturally be described as the coupling of phonon modes of the crystal to the electronic degrees of freedom. There is indeed a great deal of work in the literature dedicated to this subject and we briefly discuss some important aspects of it in the next subsection.



**Fig. 6** The percolation networks and the dimensionality of the charge transport determined from the transfer integral calculations for the molecules shown. The centers are the center of mass of the each molecular site. The connectivity and colors refer to the strength and type of the transfer integrals, as indicated by the *colored arrows*. (Reprinted (adapted) with permission from [84]. Copyright (2010) American Chemical Society)

### 1.2.2 Electron–Phonon Coupling

Following (1), the electron–phonon coupling can be described as a sum of local and non-local electron–phonon coupling terms. This division comes naturally in OSCs as the intermolecular vibrational forces are much weaker compared to the intramolecular ones.

The electron–phonon coupling is usually calculated within the harmonic approximation. A charge carrier over a site changes the potential energy surface for the site such that rearrangement of the nuclei now have a different energy shifted from the original point of the potential well by an amount of  $g_{ij}^2 \hbar \omega_{\mathbf{q}}$  [23]. This shift in energy is called the polaron binding energy in polaron transport models [25] and the reorganization energy in the terminology of the Marcus electron-transfer theory [85].

The intramolecular portion of the electron–phonon coupling is calculated approximately from the gas-phase geometries of the neutral and charged molecules by measuring the change in the total energy upon charging [25, 86]. This is commonly called the internal reorganization energy. This approach neglects the coupling of the intramolecular modes to the polarization of the neighbour molecules in the crystal environment. The aromatic conjugated molecules are highly polarizable; hence the lattice will distort to accommodate the charges [43]. Nevertheless, the external reorganization energy contributions are found to be small

[87, 88], providing some justification for their omission. In addition, the experimentally determined reorganization energy values for rubrene, pentacene, and perfluoropentacene are comparable with this local coupling picture [89, 90].

The calculation of the reorganization energy for molecules with rotatable bonds is more complicated than the fused aromatic ones. In molecules with rotatable bonds, geometry of a charged state could be very different from the neutral one. Then the simple harmonic approximation fails to capture the dependency of the total reorganization energy on the anharmonic vibrational modes that are related to the torsional motion of the backbone [91]. Moreover, there is a chance that the gas phase calculations overestimate the reorganization energy of OSCs with rotatable bonds. Although in gas phase calculations the torsional degree of freedom is controlled only by the intramolecular interactions, in the solid state the torsional motion can be hindered due to intermolecular van der Waals interactions [25]. To compensate, sometimes the symmetry constraints of the molecule in the crystal environment are imposed for the gas phase reorganization energy calculations. However, there is no guarantee that this approach will provide an accurate picture in all cases.

The non-local electron–phonon coupling constant,  $g_{ij}$ , is more challenging to calculate as it involves the modification of the electronic couplings due to phonon modes of the crystal. Usually, finite temperature dynamics of the lattice is obtained from classical trajectories and the effect of phonon modes of the crystal on the electronic couplings is observed a posteriori by extracting unique dimers from an MD trajectory. Subsequently, the transfer integral calculations based on the dimer approach mentioned earlier are performed along the trajectory [92–95]. This approach provides insight into the thermal modulation of the transfer integrals by providing a probability distribution. How large is the standard deviation compared to the mean value and how strongly does it depend on the temperature? These questions can be answered by the use of this semiclassical approach. For example, for pentacene single-crystals at 300 K, the transfer integrals for three unique dimers have been studied with data from MD trajectories. The standard deviations were found to be of the same order of magnitude as the average transfer integrals [94].

The nonlocal couplings can also be studied by the calculation of the numerical derivatives of the transfer integrals with respect to the distortions of the crystal lattice [96, 97]. These couplings represent the zero Kelvin behaviour of the system. Subsequently, they can be extrapolated to higher temperatures with the use of classical or quantum statistics. With this approach, for pentacene slightly smaller standard deviations of the couplings were observed. However, they were still of the same order of magnitude as that of the mean values. Thus in the larger oligoacenes such as pentacene, it is safe to assume that the non-local electron–phonon coupling are significant and semiclassical models of charge transfer could be of use. We should note, however, that this type of analysis should be extended to other molecular systems, as different behaviour could be observed for systems with comparatively stronger or weaker intermolecular interactions.

## 2 Structure–Property Relationships

The structure–property relationships in OSC design can be characterized at the molecular and crystal scales. As mentioned previously, a molecular OSC is usually made of molecules which are mostly interacting by van der Waals forces [1]. Thus the formation of an organic solid preserves the molecular properties to a large extent with some perturbation due to the intermolecular interactions. Since the molecule in the solid state has many important characteristics resembling its gas phase properties, the choice of the right molecule is crucial. The molecular properties such as planarity, rigidity, conjugation length, size, symmetry, side groups, and their positions, together with chemical structure determine the electronic structure parameters as well as the packing in the solid state.

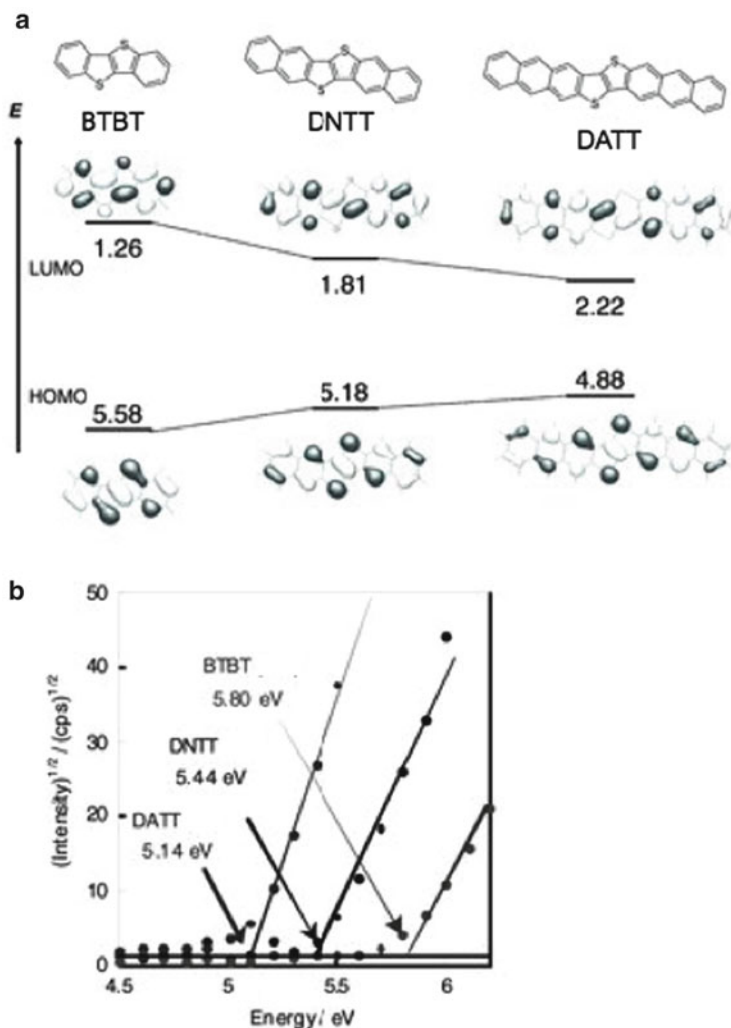
On the other hand, although the molecular properties are preserved to a certain degree in a molecular crystal, many new properties emerge. The experimental evidence shows that electronic, optical, or transport characteristics depend highly on the molecular packing [43], such as Davydov splitting [98], line broadening, and bathochromic shifts [99]. From the perspective of the OFET application, the most important feature is the semiconductivity. Since the interactions among the molecules are weak and low internal symmetry of the molecules dictates that only certain packing patterns can have  $\pi$ -orbital interactions, subtle changes in the packing patterns results in big differences in the semiconductance of a material.

### 2.1 Molecular Structure–Property Relationships

For a successful *p*-type OSC, the energy and shape of the HOMO is important. First of all, the ionization energy (IE) determines ambient stability and charge carrier polarity of the material, whether it be *p*-type or *n*-type.

Before we move on to the discussion of the structure–property relations at molecular scale, we should note here one technical issue, which is how to compare experimental and computational values of the electronic structure of the materials. Although the important quantity for material characteristics is the IE, usually the HOMO energy levels from the quantum chemical calculations are compared to the experimental IEs for practical reasons. As can be seen in Fig. 7, the HOMO energy levels closely follow the IEs from the photoelectron spectrum. In reality the difference between the gas and solid-state IEs is large and depends on the packing and, more precisely, on the nature of the  $\pi$ -orbital interactions. For example, in pentacene the gas phase IE is 6.6 eV whereas in thin films it is around 5 eV depending on the packing patterns; 4.8 eV if the molecules are standing up and 5.35 eV if they are lying over a substrate [101]. From the computational cost perspective, gas phase IE calculations are now routine, but IE calculations for the solid state are much more complicated. Therefore, the HOMO energy levels are



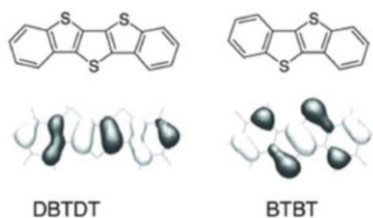


**Fig. 7** The frontier orbitals of BTBT, DNNT, and DATT (a) and their photoelectron spectrum in air (b). (Reprinted with permission from [100]. Copyright (2011) Wiley-VCH, Weinheim)

usually used instead of the IE values for practical reasons. Our discussion will also follow the same approach.

For *p*-type OSCs, the HOMO level is usually around 5 eV, and thus very close to the oxidation threshold of 5.1 eV. The more extended the conjugation, the higher the HOMO level (see Fig. 7). Thus extending the conjugation without making the material unstable in ambient conditions is a challenge and an active area of research. For example, the introduction of a thienothiophene group in the middle of an acene (Fig. 5) has been shown to help stabilize a longer molecule [102], or the

**Fig. 8** The HOMO orbitals of DBTDT (*left*) and DNNT (*right*). (Reprinted with permission from [100]. Copyright (2011) Wiley-VCH, Weinheim)



substitutions with electron-withdrawing groups usually leads to deeper HOMO levels [103].

The shape of the HOMO is another important electronic property that affects the performance [100]. If the nodal planes of the HOMO lie on the atoms such as sulfur atoms, which are important for intermolecular interactions, the strength of the intermolecular interactions and thus the electronic coupling are reduced. For example, in molecules with thiophenes, sulfur–sulfur interactions are very important in the crystal and maintaining the short contacts among these atoms is important for stronger couplings. Figure 8 shows the shape of the HOMO level of molecules labeled as DBTDT and BTBT. DBTDT has nodal planes over the sulfur atoms whereas BTBT does not. As suggested by Takimiya and coworkers, DBTDT has larger S···S distances as well as much weaker transfer integral values: 11 and 17 meV [100] compared to transfer integral values of 67 and 26 meV in BTBT-C<sub>8</sub> [104].

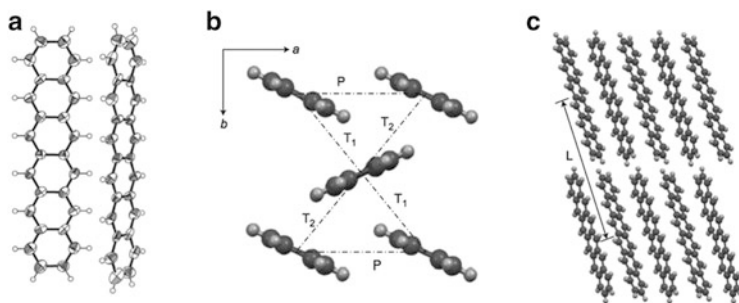
Together with the chemical structure and availability of the  $sp^2$  hybridized atoms, the size and rigidity of the molecule determines the extent of the conjugation. This, in turn, affects several parameters related to charge transport. One important consequence of the size of the molecule is the strength of the local electron–phonon coupling. Let us assume that a single charge carrier residing on a molecular site with a rigid conjugated backbone can simply be modeled as a particle in a box. Then we can consider that the reorganization energy required to accommodate the charge carrier scales with the length of the box. Usually, the more extended the conjugation, the smaller the reorganization energy and the better the charge transport properties. However, this is only true for a set of similar compounds. In the following examples, we explain what we mean by similar.

Since hexacene has recently been synthesized and its OFET mobility has been measured [105], the oligoacene family of compounds provide a good set to illustrate some of the structure–property relationships discussed above. The charge transport parameters of the members of the oligoacene family with  $n = 2–6$  phenyl rings are presented in Table 1. The transfer integral values listed correspond to the unique dimers shown in Fig. 9b–c.

The trends observed for the reorganization energy, transfer integrals, and ensuing mobilities in oligoacenes confirm the discussion above. First, the more extended the conjugation, the higher the HOMO energy level and the smaller the reorganization energy. Second, although the transfer integral for the parallel arrangement,  $P$ , does not improve as the intermolecular distance also gets larger, the edge to face

**Table 1** Calculated hole transport properties of oligoacenes. For details of the calculations see [105] and references therein. (Reprinted (adapted) with permission from [105]. Copyright (2012) Nature Publishing Group)

Compound	HOMO (eV)	Reorganization energy (meV)	R(Å), Transfer integrals (meV)				Mobility (cm <sup>2</sup> V <sup>-1</sup> s <sup>-1</sup> )
			T <sub>1</sub>	T <sub>2</sub>	P	L	
Naphthalene	-5.80	183	5.01, 8	5.01, 8	5.93, 36	8.64, 0	0.0511
Anthracene	-5.24	138	5.22, 19	5.22, 19	6.01, 42	11.12, 0	0.158
Tetracene	-4.87	113	4.77, 70	5.13, 22	6.06, 37	13.44, 1	0.470
Pentacene	-4.61	95	4.76, 79	5.21, 45	6.27, 31	16.11, 1	0.832
Hexacene	-4.42	79	4.72, 88	5.22, 60	6.31, 37	18.61, 1	1.461

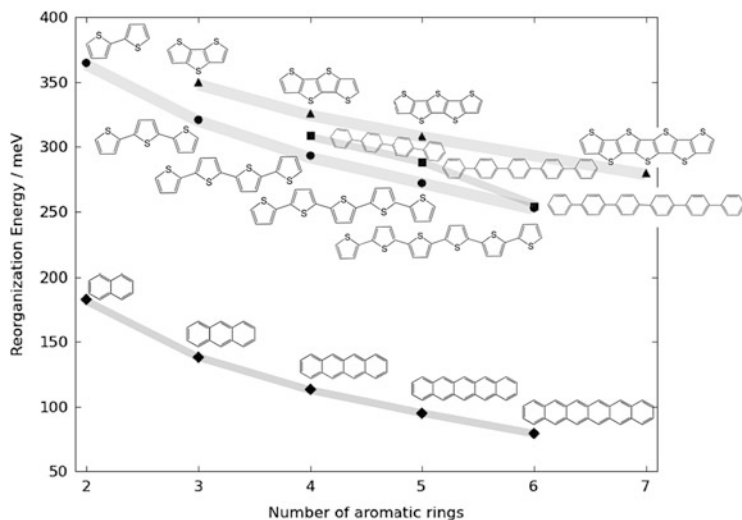


**Fig. 9** (a) ORTEP drawing of two adjacent hexacene molecules. (b) Arrangement of hexacene molecules in the  $ab$ -plane. (c) Arrays of hexacene along  $a$ -axis. The labels  $T$ ,  $P$ ,  $L$  denote the pairs of molecules used in the transfer integral calculations. (Reprinted (adapted) with permission from [105]. Copyright (2012) Nature Publishing Group)

interaction terms,  $T_1$  and  $T_2$ , improve going from  $n = 2$  to  $n = 6$ . Together with the smaller reorganization energies for the larger oligoacenes, the estimated mobility values improve as well. Similar behavior was also observed for oligothiophenes: the longer the oligomers, the smaller the calculated reorganization energy [106]. Experimental evidence also shows that the longer oligothiophenes, four to six rings, have higher mobilities compared to shorter ones [107]. Usually four or more rings are required in an OSC molecule for good performance.

For structurally different families of compounds, such as heteroacenes, the reorganization energy trends need to be carefully analyzed and molecular similarity needs to be taken into account. For example, the thienoacenes usually have higher reorganization energies compared to oligoacenes (see Fig. 10). However, the polyphenyls have quite large reorganization energy values compared to acenes, even higher than polythiophenes. The trends can depend on structural factors such as the type of bonds, the availability of the torsional angles, or the spatial arrangement of the aromatic rings. Following the classification suggested by Takimiya and coworkers [100], in Figs. 10 and 11 we show that if the structural similarities are taken into account and the acene- and thiophene-based OSC molecules are grouped accordingly, the extended conjugation lowers the reorganization energy. However, the slopes of the curves representing the change in the reorganization energy as a function of the number of rings could be very different for each group of compounds.

One avenue through which to pursue a priori prediction of the high performance OSC molecules is the use of quantum chemical descriptors in quantitative structure–property (QSPR) studies. By combining molecular descriptors from cheminformatics with *ab initio* quantum chemistry, Misra et al. showed that it is possible to accelerate the search for smaller reorganization energy materials [108]. In a study of a family of 200 polycyclic aromatic hydrocarbons, by assuming that all of the molecules form similar liquid crystalline stacks, the reorganization energy was identified as the dominant factor influencing the charge transfer rates.

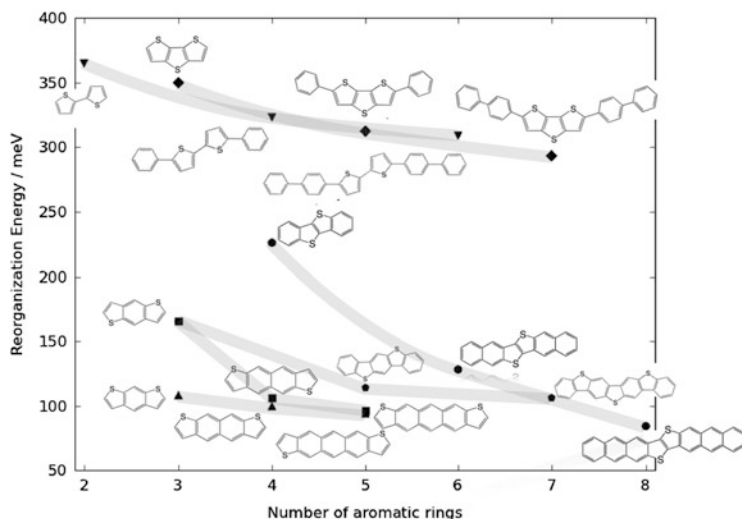


**Fig. 10** The reorganization energies of oligoacene and thienoacene families of homocycles. References for the reorganization energy values: oligoacenes (*diamonds*) [105], polythiophenes (*circles*) [106], fused-thiophenes (*triangles*) [25], polyphenyls (*squares*). (Atahan-Evrenk and Aspuru-Guzik (2012), unpublished results)

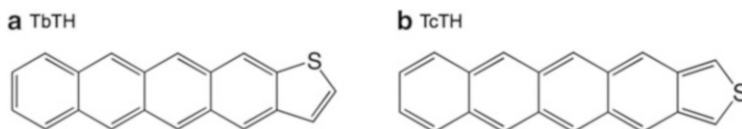
Based on a QSPR study of various molecular descriptors, a weak correlation of the reorganization energy with the molecular signature (a canonical representation of the atom's environment up to a preferred height [109]) and another weak correlation with the electronic eigenvalue descriptors were identified. Then these two weakly correlated descriptors were combined into a QSPR model that estimated 80% of the reorganization energies within an error margin of 20 meV. This success rate was quite good as the only quantum chemistry calculation involved was the ground state geometry optimization of the neutral molecular structure.

Due to the benefits of low reorganization energy in the charge transport, a few strategies based on structural modifications are developed. For example, the presence of the nonbonding character in the HOMO level is identified as a reorganization energy lowering strategy. A comparison of tetraceno[2,3-*c*]thiophene (TcTH) and tetraceno[2,3-*b*]thiophene (TbTH) showed that the fusing of thiophene in a symmetric manner results in 30 meV smaller reorganization energy in TcTH (Fig. 12a) compared to TbTH (Fig. 12b) [110, 111]. Based on the same principle, the cyanide substitutions, and substitutions by weaker electron-withdrawing groups (for example, chlorination instead of fluorination) has been identified as a reorganization energy lowering strategy [112–115]. In addition, intra-ring substitutions such as the replacement of a carbon atom with nitrogen were also shown to lower the reorganization energy.

Last but not the least, choosing the right molecular structure has significant consequences for solid-state packing. The molecular group symmetry, polarizability, side group positions, the intermolecular interactions, etc., play a role in



**Fig. 11** The reorganization energies of thienoacene heterocycles: phenyl substituted dithienothiophenes (*diamonds*) (Atahan-Evrenk and Aspuru-Guzik (2012), unpublished results), phenyl substituted dithiophenes (*down triangles*) (Atahan-Evrenk and Aspuru-Guzik (2012), unpublished results), diacene-fused thienothiophenes (*circles*) ([6], Atahan-Evrenk and Aspuru-Guzik (2012), unpublished results), benzene-thiophene alternating molecules (*pentagons*) ([25], Atahan-Evrenk and Aspuru-Guzik (2012), unpublished results), acene-anti-dithiophenes (*squares*) ([25], Atahan-Evrenk and Aspuru-Guzik (2012), unpublished results), acene-syn-dithiophenes (*triangles*) ([25], Atahan-Evrenk and Aspuru-Guzik (2012), unpublished results)



**Fig. 12** Symmetric substitution leads to lower reorganization energy, 97 meV of TbTH compared to 66 meV in TcTH [110]

determining the stable lattice conformations, thus leading to enhanced or reduced mobility. For example, relative abundance of C–H (through the peripheral H-atoms) vs C–C interactions affect the tendency to pack in herringbone or  $\pi$ -stacked packing forms [116]. The molecules with H-bonding groups such as quinacridones can form supramolecular synthons [32, 117]. The symmetry of the molecular structures also affects the packing in the solid state. For example, molecules with centrosymmetry can form better short-contact networks [100]. In the following section we further discuss the effect of the modification of the molecular units to achieve high performance and the crystal structure–property relationships.

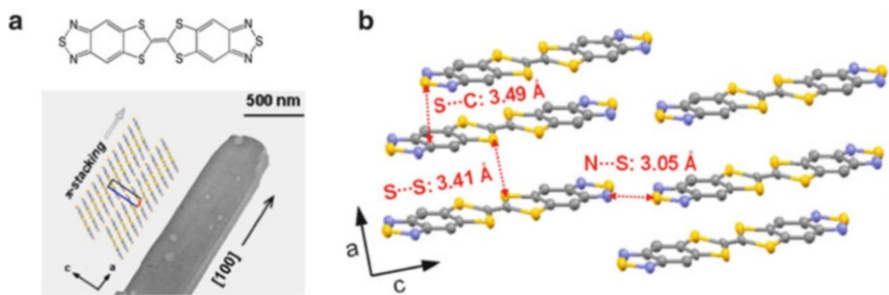
## 2.2 Crystal Structure–Property Relationships

Among the crystal structure–property relationship studies in OSCs, perhaps the most striking example is the case of rubrene (Fig. 4d). With a record single crystal OFET mobility of  $20 \text{ cm}^2 \text{ V}^{-1} \text{ s}^{-1}$  [58], rubrene was a remarkable improvement from tetracene. Although the phenyl groups added to tetracene backbone do not participate in the  $\pi$ -conjugation, they help the tetracene backbone to  $\pi$ -stack right very close to one of the maxima of the transfer integral surface [118]. The phenyl groups also provide a lock-in for the backbone so that displacement along the short axis, which usually yields lower transfer integrals in oligoacenes, is prevented. Understanding of the rubrene crystal structure provided motivation for further studies to control the solid-state packing to enhance performance.

To study further the structure–property relationships in rubrene and its derivatives, the effect of the substitutions of the external phenyl rings on the crystal structure was examined [119, 120]. Haas et al. showed that, depending on the positions of the substitutions, the  $\pi$ -stacking geometries and the interlayer distances between the backbones could be controlled. In particular, they have found that the substitutions on the 5,11 phenyls cause a large twist in the backbone leading to a polymorph with no charge carrier mobility, whereas the *tert*-butyl substitutions on the 5,12 phenyls showed a similar packing pattern to rubrene with similar OFET characteristics despite a 31% increase in the interlayer spacing. In a recent study, McGarry et al. [120] showed that the interlayer distance could also be controlled by the methyl and trifluoromethyl substitutions of the external phenyl rings. By means of this approach, rubrene derivatives with OFET mobility comparable to rubrene were synthesized. In particular, they had a success with dual substitutions by trifluoromethyls that resulted in ambipolar function as well as a high hole mobility.

Another successful example of charge transport tuning with structural modification is the family of substituted pentacenes [121]. Among the *peri*-functionalized pentacenes, tips-pentacene (Fig. 4a) with triisopropylsilylethynyl groups at the 6,13 positions emerged as one of the most successful engineering examples [122]. Along with solution processability and ambient stability, the substitutions changed the herringbone type of packing into  $\pi$ -stacking conformation. Subsequently by the solution shearing method a metastable state of tips-pentacene with better performance has been achieved with an order of magnitude increase in the mobility [123]. The theoretical investigation of the transfer integrals corroborated the experimental findings and showed that the solution-sheared films indeed have three times stronger transfer integrals [123]. Recently Bao and co-workers showed even higher mobility of  $11 \text{ cm}^2 \text{ V}^{-1} \text{ s}^{-1}$  for a solution processed film of tips-pentacene, demonstrating the fact that the control of the solution deposition is crucial for high performance materials [59]. Tips-pentacene and rubrene are among the few OSCs which show band-like transport in an OFET setup.

Another crystal packing control strategy is the engineering of sulfur–sulfur interactions. For example, the chalcogen substitutions at the *peri*-positions of pentacene promotes the  $\pi$ -stacking interactions [124]. In comparison to the



**Fig. 13** Benzothiadiazole-tetrathiafulvalene with  $\pi$ -stacking interactions for single-crystal nanowire applications (a), short contacts (b). (Reprinted (adapted) with permission from [125]. Copyright (2013) American Chemical Society)

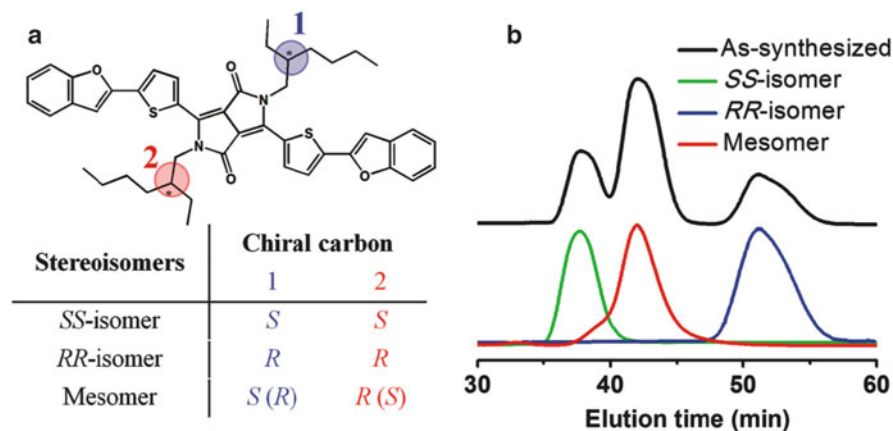
herringbone packing in pentacene, hexathiapentacene has strong  $\pi$ -stacking and unusually short intermolecular sulfur–sulfur distances. These substitutions usually lead to one-dimensional conduction and thus this strategy has the potential to develop semiconducting nanowires. Similarly for benzothiadiazole-tetrathiafulvalene single-crystal nanowires (see Fig. 13), the use of tetrathiafulvalene groups with strong S··S interactions and thiadiazole groups promotes the  $\pi$ -stacking interactions, and the intermolecular stacking distances could be controlled and short-contacts such as S··S (3.41 Å), S··C (3.49 Å), and S··N (3.05 Å) could be achieved [125]. Further discussion about additional strategies for inducing  $\pi$ -stacking could be found in [126].

Although one-dimensional transport could be advantageous for nanowire applications, reducing the dimensionality of the mobility has the potential to make the charge transport very susceptible to the presence of defects [127]. A higher dimensional transport network is desirable for OFET applications as it provides alternative pathways for transport. In recent work, for example, the methylated DNTT derivatives are synthesized and significant transfer integrals in all three dimensions is demonstrated [128].

The engineering of the crystal structures through bulky substitutions has also been studied in the case of oligothiophenes with trimethylsilane end groups [129]. It has been shown that through end-substitutions the in plane tilt and the offset of the oligothiophene backbones can be controlled and better or worse electronic couplings among the molecules can be enforced.

Another example of the substitutional engineering of the crystal structure is the end-substituted 5,5'-bis(4-alkylphenyl)-2,2'-bithiophenes (P2TPs) [130]. Depending on the even and odd alkyl chain substitutions, the tilt angle and electronic couplings in the two dimensional deposition layers of the SCs can be controlled. The solid-state packing of P2TPs molecules with different length alkyl side chains ( $n = 3, 8$ ) were analyzed with grazing incidence X-ray diffraction. The data showed that having an even or an odd length chain controls the tilt angles of P2TP molecules on the self-assembled monolayers of ODTs. The even length alkyl chains yielded larger tilt angles and higher mobility compared to those with an odd number of





**Fig. 14** The chemical structure of DPP(TBFu)<sub>2</sub> with two chiral carbons highlighted (1 and 2) and the resulting stereoisomers (a), elution profiles for the as-synthesized and isolated stereoisomers (b). (Copyright reference [131])

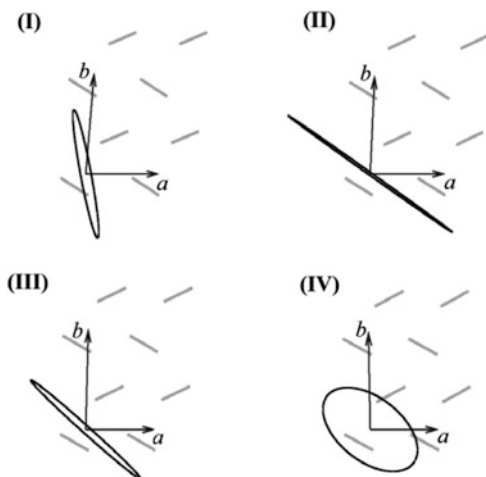
carbon atoms. The transfer integrals for the unique dimers extracted from the corresponding crystal structures also corroborated the odd-even trend. In addition, MD simulation of the surfaces showed that the tilt angle is indeed controlled by the parity of the side chains.

In addition to the position and the length of the side groups, stereoisomerism affects the FET mobility [131]. For example, due to *RS* arrangement of the chiral carbons in DPP(TBFu)<sub>2</sub> (labeled 1 and 2 in Fig. 14), the mesomer has been shown to have better  $\pi$ -orbital stacking interaction as well as higher mobility compared to the case of *SS* or *RR* isomers. The mesomeric form had a packing distance of 3.38 Å with a flat conjugated backbone compared to 3.47 Å in the case of *SS* or *RR* isomers. The mesomeric form also performed better than the case where no stereoisomer was selected (as-synthesized). Therefore, this study highlighted that chirality of the substituted groups also needs to be taken into consideration for tuning of properties with structural modifications.

Another important concept in understanding the crystal structure–property relationships is the polymorphism in OSCs. Like in drug molecules, where polymorphism has direct consequences for the solubility and thus bioavailability of a drug, in OSCs polymorphism has important consequences for the charge transport properties. The polymorphs of an OSC can have totally different mobility tensors. For example, Fig. 15 illustrates the possible variations in the (an)isotropy in the mobility tensor for four polymorphs of pentacene [132]. Among four different polymorphs investigated, apart from one (polymorph IV), all of them showed remarkable anisotropy in the transport plane. This might have important implications for the device configurations.

It is also possible that several polymorphs of an OSC with different charge transport characteristics could be accessible in operating temperatures. It has been shown, for example, that, for a fluorinated derivative of an anthradithiophene, a

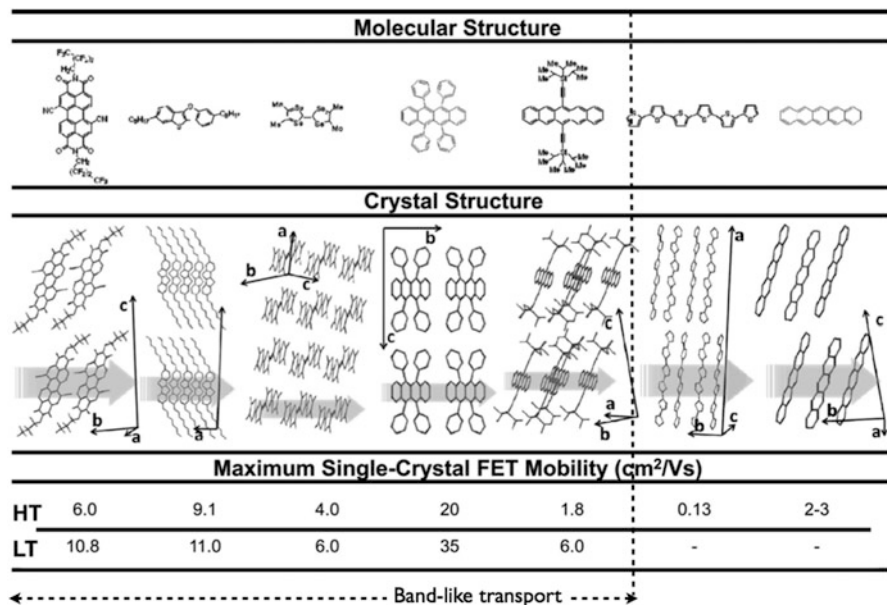
**Fig. 15** The mobility tensors in the  $ab$ -plane for four polymorphs of pentacene. (Reprinted (adapted) with permission from [132]. Copyright (2005) American Chemical Society)



phase transition between two polymorphs occurs as the temperature rises from 260 K to 300 K [29]. For this system, the field-effect mobility of the films increases as a function of increasing temperature with particular slopes for each polymorph. This finding has immense significance for the consequences of polymorphism in OSCs in commercial applications.

Lastly, we would like to discuss the role of polarizability in the electronic structure and charge transport mechanisms [133]. The electronic structure is highly influenced by the molecular polarizability and the geometrical arrangement of the molecules. In OSCs, there is, for example, about 1 eV difference between the IEs in the gas phase and the solid state. This difference is due the polarization energy [134]. For example, the IE of pentacene in the gas phase is about 6.6 eV compared to about 5 eV in thin films. Moreover, it is 5.35 eV when the molecules lies flat over a substrate, and 4.8 eV when they are standing [101].

An important observation related to the correlation of the molecular polarizability to the band-like transport was discussed recently by Minder et al. [135]. In particular, they correlated the observation of the band-like charge transport in OFETs with the polarizability of the conjugated backbones as well as the collective dielectric response of the OSC crystal. In particular, for a group of compounds shown in Fig. 16, they identified two important factors potentially leading to band-like transport in OFETs: (1) the presence of substituents to influence the coupling among the adjacent OSC layers and (2) the orientation of the molecules and their polarizability tensors with respect to the charge transport direction. They argued that PDIF-CN<sub>2</sub> and BTBT-C<sub>8</sub> show band-like transport because the dielectric coupling of the adjacent layer as well as the gate is screened by the presence of the side groups. This notion is based on the understanding that the conductance channel is the first layer of the OSC film over the gate dielectric and charge transport mostly happens in this first layer. In addition, the alignment of the



**Fig. 16** Analysis of the molecular structure and packing for different organic molecules (from left to right: PDIF-CN<sub>2</sub>, BTBT-C<sub>8</sub>, TMTSF, rubrene, TIPS-pentacene, sexithiophene, and pentacene). To date, PDIF-CN<sub>2</sub>, BTBT-C<sub>8</sub>, TMTSF, rubrene, and TIPS-pentacene are the only organic semiconductors exhibiting band-like transport in an OFET configuration. The values of mobility are either at room temperature (HT) or low temperature (LT—for the molecules in which band-like transport has been observed). (Reprinted (adapted) with permission from [135]. Copyright (2012) Wiley-VCH, Weinheim)

molecules with respect to the gate is crucial: the dielectric coupling is smaller if they are parallel to the gate than when they are perpendicular to it. Therefore, band-like transport is also observed in TMTSF, rubrene, and tips-pentacene since the conjugated molecular backbones in these crystals lie parallel to the gate. They also argued that pentacene and oligothiophene have never shown band-like transport in an OFET setting because they are arranged perpendicular to the dielectric surface and have no terminal alkyl chains to reduce the coupling among the adjacent layers. Further work to quantify and measure these observations would be of great value to the design and engineering of high-performance OSC materials.

### 3 Crystal Structure Prediction for Organic Semiconductors

Arguably, the most important piece of information needed for the theoretical characterization of an OSC crystal is the availability of the crystal structure. As illustrated in the previous sections, the literature is full of analyses of the crystal

structures of experimentally known materials. The crystal structure prediction for OSCs a priori to synthesis, however, is scarce. Except for a few cases of limited solid-state structure prediction [4, 6, 136], it remains virgin territory. We associate the sporadic interest with lack of commercial applications. In the near future we expect that OSCs will be used in commercial applications ubiquitously and hence a more detailed understanding of the polymorphism or structural stability will be demanded by the market.

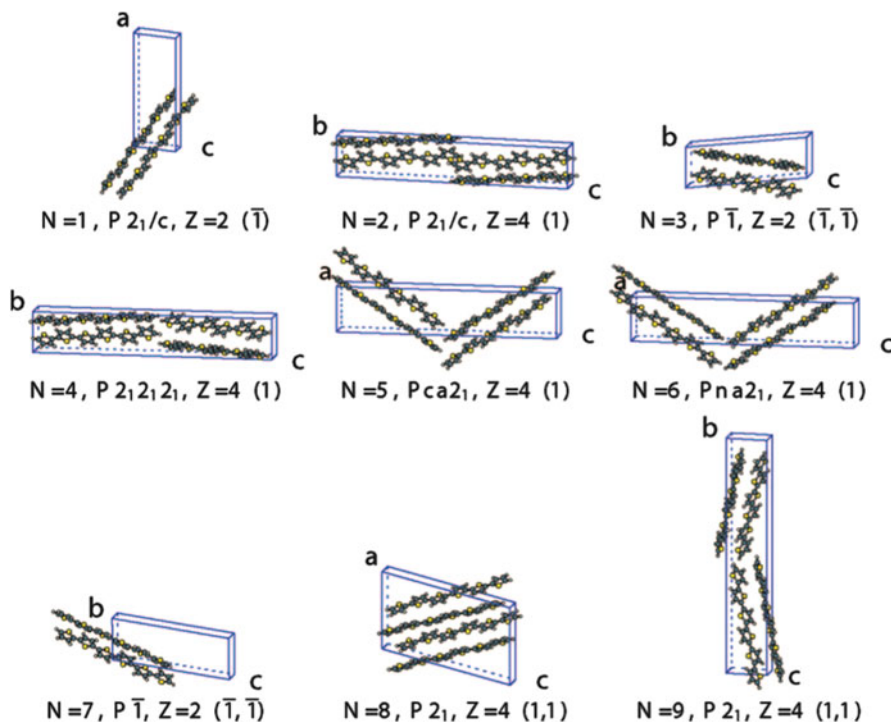
From the crystal structure prediction point of view, one advantage of the molecular OSCs with conjugated backbones is that they have mostly two-dimensional geometries and pack in a few specific patterns. For example, many years ago Desiraju and Gavezzotti [116] studied the crystal structures of polynuclear aromatic hydrocarbons. They showed that all of the aromatic hydrocarbons could be grouped into four distinct packing patterns: (1) herringbone pattern (polythiophene, pentacene), (2) pair-wise (*sandwich*) herringbone pattern (perylene ( $\alpha$  phase), pyrene), (3) flattened-herringbone pattern (coronene), and (4) graphitic pattern (tribenzopyrene). Based on their analysis of the structures in terms of the presence of the type of intermolecular interaction, i.e., C $\cdots$ H, C $\cdots$ C, or H $\cdots$ H, they successfully predicted the packing type of some of the unknown structures at the time such as the sandwich structure for the benzo(*e*)pyrene [137]. Nevertheless, the most practical applications of OSCs involve intra-ring substitutions, heterocycles, or side group additions to the backbone which complicate the crystal structure prediction.

Most crystal structure prediction studies for OSCs reported to date involve the structures of the known crystals of well-studied molecules such as oligoacenes or oligothiophenes. Usually a conventional molecular force field is used in conjunction with electrostatic potential (ESP) fitted point charges to describe the interactions in an experimentally known crystal structure. These studies provide a good basis for understanding the performance of the force fields and the type of improvements required in the force field parameters for particular systems. For example, Marcon and Raos [138] studied the crystalline oligothiophenes with improved MM3 force fields. In particular, they optimized the inter-ring torsion potentials and calculated the atomic charges as well as higher terms of the electrostatic interactions derived from distributed multipole analysis (DMA) with quantum chemistry methods. The systems studied ranged from herringbone packing structures ( $\alpha$ -tetrathiophene,  $\alpha$ -sexithiophene) to  $\pi$ -stacked configurations as well as an alkyl-chain substituted sexithiophene. Interestingly, they concluded that the MM3 force field with point atomic charges gave satisfactory results for all the *p*-type OSCs they have studied. Only the *n*-type OSC, perfluorosexithiophene, required the more accurate electrostatic modeling through the DMA. Therefore, they concluded that the more costly DMA approach is not justified for the *p*-type OSCs studied. MD simulations at the same level of theory are performed to investigate the effect of the temperature, and to ensure a better comparison of the predicted structures with the structures from room temperature X-ray diffraction. They found that MD simulations at room temperature systematically resulted in approximately 10% lower crystal densities. Among several variations of MM3 force field adapted for the

oligothiophenes, MM3 with the *ab initio* corrected torsion potentials, ESP charges, and adjustment of the dispersion terms with scaling of the dispersion parameters showed the best performance.

The known polymorphs of oligoacenes and oligothiophenes also provide a basis for the test of effective strategies for initial structure search and polymorph prediction. Della Valle and coworkers studied the polymorphs of tetracene [139], pentacene [140, 141], and sexithiophene [142], with the assumption of rigid bodies for the molecular structures. They employed a hybrid approach involving uniform sampling (low-discrepancy Sobol' sequence) of the energy landscape by including the crystallographic symmetry constraints. The completeness of the search space is maintained by adapting the capture-recapture method from wildlife ecology. The intermolecular potentials are described by atom–atom interactions where electrostatic interactions are defined in terms of the point charges derived from quantum mechanical calculations. In particular, for sexithiophene they employed an AMBER force field with restricted ESP fitted charges, and for pentacene and tetracene an atom–atom Buckingham model with Williams parameter set IV [143] (with ESP charges for the tetracene) is used. For tetracene and pentacene the initial search was constrained to triclinic structures with two independent molecules per unit cell. After the lattice energy minimizations, the crystal space groups are assigned to the optimized lattices by the use of PLATON program [144]. For sexithiophene the initial search was constrained to 16 structural classes with triclinic, monoclinic, and orthorhombic lattice types. In the case of tetracene and pentacene, most of the minima belonged to the *P1* and *P2*<sub>1</sub>/*c* groups and have the layered herringbone-type packing. The deepest minima for tetracene corresponded to the high temperature-low pressure polymorph known by X-ray diffraction. From the global search for the low energy polymorphs of pentacene, they successfully found the C and H polymorphs as their rank 1 and rank 2 structures. In the case of sexithiophene among nine deepest minima structures, six different space groups are observed, lowest energy polymorphs also having herringbone-type packing (see Fig. 17). Again, the two known polymorphs of sexithiophene have been identified correctly with this methodology. Unfortunately, the same approach failed in the blind tests and Della Valle et al. concluded that the success in the case of tetracene, pentacene, and sexithiophene could be attributed to the symmetry, rigidity, and planarity of these molecules and the presence of the short-range isotropic interactions [142].

Another approach to speed up the optimization of the solid form of materials is based on genetic algorithms (GA), which are widely used in the crystal structure prediction of inorganic materials [145]. Facelli and co-workers [146] adapted the GA for the prediction of the crystal structures of benzene, naphthalene, and anthracene. In the GA approach, genes are a set of geometric parameters defining the spatial arrangements of the rigid bodies in three-dimensional space. Then the genomes are constructed as the collection of parameters defining the crystallographic axes, molecular positions, orientations, and number of molecules in the unit cell. Although no assumptions are made for the crystallographic axes, the unit cell parameters are limited to a certain region of the space to make the problem more



**Fig. 17** Structure of the nine deepest minima, shown with an orientation in which the shortest cell axis (either  $a$  or  $b$ ) is approximately perpendicular to the plane of the page. Minima are labeled by their energy rank  $N$  (also indicated in Table 2) and structural class (space group,  $Z$ , and site symmetry). (Reprinted (adapted) with permission from [142]. Copyright (2008) American Chemical Society)

tractable. One advantage of this approach is that there are no assumptions on the  $Z$  values, i.e., the number of molecules in the unit cell. At every step of the optimization, the lattice energies are calculated with an empirical force field and the lattices leading to higher energies are discarded. Then through the mutations and crossovers performed on the genomes, new structures were generated and minimized until a certain convergence criteria for the lattice energy was reached. Again, here the empirical force fields used were based on van der Waals and electrostatic terms with atomic point charges [143]. Despite the many assumptions involved, the resulting structures were surprisingly successful with lattice energy differences of 1% from the experimental crystals. In addition to the experimentally known structures, a new set of polymorphs was determined by the GA approach. Although this work assumed rigid-bodies, an adaptation of the same algorithm to flexible molecules was also demonstrated [147]. Despite the use of a more advanced force field, the Amber force field used in CHARMM optimizations, the same success for the structure prediction was not observed for a set of flexible molecules. It is perhaps indicated that the conjugated backbone, and hence relative

rigidity and flatness of the OSCs, significantly simplify the search problem, and therefore relatively simpler force field parameter sets can provide enough accuracy.

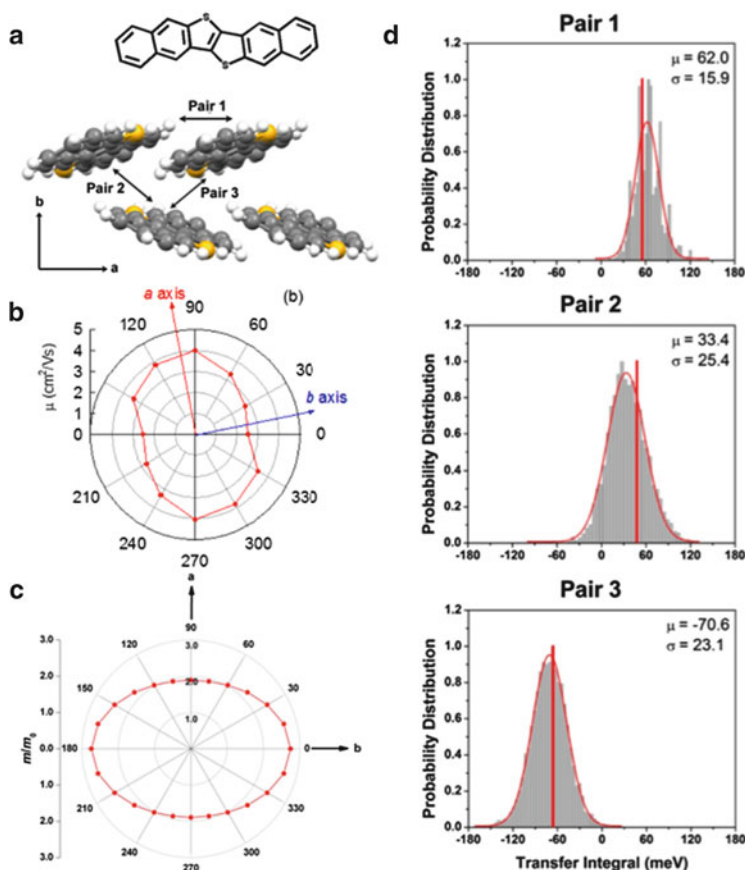
One of the strategies to limit the search space is to take advantage of the fact that 93% of all the space groups of organic molecular solids reported in the Cambridge Structural Database belongs to the 18 most frequent space groups among a total number of 230 [148]. Moreover, about 92% of all organic molecular solids have only one molecule in the asymmetric unit cell [149]. Therefore the initial search space with different packing forms are usually limited to a subset of the most prevalent space groups. We should note however that reported structures in the database does not include all the polymorphs for various reasons [150]. Although the omission of the less likely space groups could provide enough statistics, it does not guarantee that some of the polymorphs of a material might not have been left out. Indeed, in the last blind test, the most successful searches were those that spanned all possible space groups.

For screening many molecules with the potential for high performance, the speed at which the lattice configurations can be ranked is crucial. In the following we summarize an even simpler approach for the structure prediction based on the structural and molecular similarities among molecules. This practical approach is analogous to homology modeling in drug design. Taking advantage of the molecular structural similarities, a known crystal structures is adapted for a new molecule and subsequently optimized with electronic structure methods. A similar strategy, ligand replacement, is also adapted for the prediction of hybrid frameworks [151].

In 2007 Takimiya and coworkers reported two important compounds: BTBT and DNNT (Fig. 7a) with high hole mobility and extraordinary shelf-life. DNNT showed characteristics comparable to pentacene but better ambient stability. Our analysis [152] of the microscopic charge transport parameters of DNNT confirmed that extended aromatic structures have small reorganization energy and mildly anisotropic electronic couplings in the herringbone packing plane. Moreover, the non-local electron–phonon couplings investigated in terms of the thermal modulation of the transfer integrals were found to be weaker, for example, compared to pentacene. The transfer integrals were calculated (at the level of B3LYP/6-31G\*) for the unique dimers extracted from an MD trajectory with an MM3 force field with ESP fitted charges. Figure 18 shows the moderate anisotropy of the mobility (Fig. 18b, c) and the weak thermal modulation of the transfer integrals (Fig. 18d).

This analysis motivated us to study a small library of thienoacene derivatives shown in Fig. 19 [6].

As a first strategy of ranking of the molecules in this library, the gas phase geometries were optimized and internal reorganization energies calculated. The two compounds, **2** and **7**, with the smaller reorganization energies (smaller than pentacene reorganization energy of 95 meV) of 85 and 77 meV respectively, were identified as potential high performance materials. Subsequently, the crystal structure minimizations for these two molecules were performed. This involved the optimization of the unit cells derived from the parent compound (DNNT) with Dreiding force field and ESP fitted charges as implemented in the Forcite module [154]. The symmetry imposed (P2<sub>1</sub>) and the symmetry relaxed (P1) optimizations

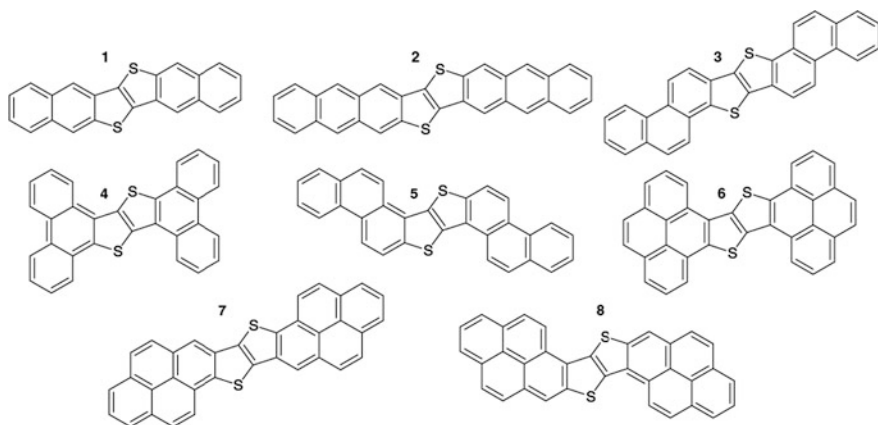


**Fig. 18** (a) The packing in the  $ab$ -plane in DNTT crystals and molecular dimer pair investigated for transfer integral calculations. (b) The experimental moderate anisotropy in the  $ab$ -plane. (Reprinted with permission from [153]. Copyright (2009) AIP Publishing LLC). (c) Effective charge carrier masses obtained from the dispersion of the valence bands [95]. (d) The probability distributions for the transfer integrals extracted from an MD trajectory; the vertical lines correspond to the transfer integrals from the optimized equilibrium structures with the same level of theory. (Reprinted with permission from [95]. Copyright (2010) American Chemical Society)

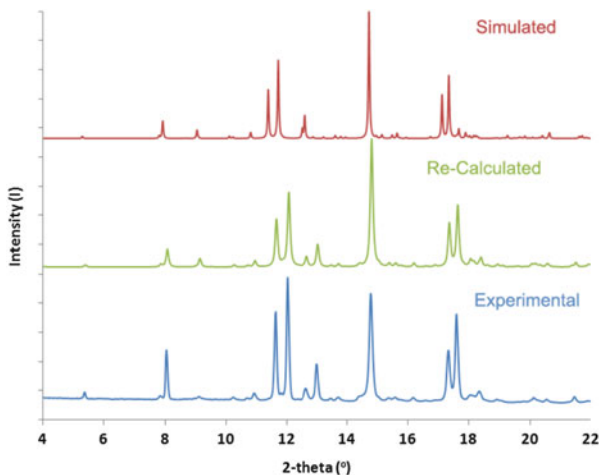
lead to similar packing. Finally, the transfer integrals for the dimers from the optimized structures were calculated and, based on approximate Marcus electron transfer rates, the more promising material was identified as molecule 2. This material, for which a performance better than pentacene had been anticipated, was eventually synthesized and OFET measurements of the single crystals revealed a record high mobility of  $12 \text{ cm}^2 \text{ V}^{-1} \text{ s}^{-1}$  [6].

The crystal structure was confirmed with powder X-ray with remarkably good agreement. We further adjusted the unit cell parameters by matching the experimental and predicted patterns (see Fig. 20). The lower density predicted by the





**Fig. 19** DNTT (1) derivatives studied for charge transport capacity [6]



**Fig. 20** The powder X-ray diffraction pattern of molecule 2 from experimental powder (*bottom*), the re-calculated structure by matching the simulated structure to the experimental powder pattern (*middle*), and the original predicted structure (*top*). (Powder simulation wavelength = 0.9758)

MM3 with ESP charges is a known property of this approximation unless the dispersion coefficients of the  $R^{-6}$  terms are optimized for the particular system [138]. Although the cell volume error in Table 2 is 6%, in reality it is larger as there is usually an expansion of 6% of the volume as the temperature rises from 0 to 300 K. Since the density of the experimental structure is larger, the ensuing transfer integral values improved. Despite its simplicity, this approach has led to the discovery of a new high-performance materials as well as helped the elucidation

**Table 2** The unit cell parameters for the predicted crystal structure for molecule 2 and for the crystal structure matched to the powder X-ray spectrum

Cell properties	Predicted	Matched to powder X-ray
Space group	P2 <sub>1</sub>	P2 <sub>1</sub>
A (Å)	6.444	6.225
B (Å)	7.6217	7.577
C (Å)	21.203	20.824
$\alpha$ (deg)	90	90
$\beta$ (deg)	89.24	87.23
$\gamma$ (deg)	90	90
Cell volume (Å <sup>3</sup> )	1,041.21	981.05

of the crystal structures from powder patterns. Again, for molecule 2 the rigid and planar molecular structure simplified the crystal prediction process tremendously. Similarly, Chang et al. predicted the polymorph structures for the substituted tetracenes with Dreiding forcefield with ESP fitted charges [136]. Subsequently, based on the semiclassical charge transfer rate from Marcus theory, they have identified two  $\pi$ -stacking high-performance compounds. These compounds as yet to be synthesized.

Although we have focused on the single-crystals of *p*-type OSCs, we would like to point out that the prediction of thin-film structures and the effect of various substrates on the film growth have drawn considerable interest over the years and a good summary discussing the recent developments can be found in [155].

## 4 Conclusions and Outlook

In this chapter we have discussed the molecular and crystal structure–property relationships as well as the state-of-the-art crystal structure prediction for OSCs. We focused on the *p*-type OSCs for OFET applications. Although we have a good understanding of structure–property relationships through the theoretical and experimental characterization of OSC crystal structures obtained from X-ray diffraction, the prediction of new OSCs from molecular structures is still in its infancy. There have been successful predictions of solid forms of rigid and planar OSC molecules such as pentacene; nevertheless, the more general CSP methodologies to predict crystals of OSCs with functional groups or long alkyl chains remain to be carried out.

The recent blind tests organized by the Cambridge Structural Database showed significant progress towards the prediction of the crystal structures of organic molecular solids [37, 38]. To date, studies on the crystal structure prediction of OSCs have been limited to classical force fields with mostly ESP fitted charges. We believe that there is room for a great deal of improvement by adaptation of the state-of-the-art methodologies that were successful in the blind tests.

If crystal structure prediction for OSCs can be realized, together with theoretical characterization techniques, it can provide valuable guidance for better OSC design. For example, one important area where crystal structure prediction has tremendous potential to facilitate OSC engineering is the optimization of side groups added for solubility [30]. If possible, these studies would tell the synthesis experts what substitutions would lead to what type of crystal structures and whether the substitutions enhance or degrade charge transport. This would facilitate the design process by rational design of the length, type, and positions of the side groups. Moreover, theoretical prediction and characterization can provide insights into the intrinsic limit of a material. The knowledge of whether the intrinsic limit of a semiconductor is reached and what type of changes in the structure can lead to improvement has the potential to facilitate the OSC design tremendously. In its most useful form, the crystal structure prediction can provide the thermodynamically stable structures a priori to synthesis, calculate the energy barriers between low lattice energy configurations, tell us what kind of laboratory conditions would lead to the better performing polymorph, or how to avoid the worse polymorphs with the manipulation of process conditions.

To conclude, we believe that we now have a good understanding of the structure–property relationships in OSCs and, by the adaptation of the state-of-the-art crystal structure prediction methods, there is a great potential to help explore new high performance OSCs for OFET applications. If crystal structure prediction for OSCs can be realized, the same tools can also promote discoveries of new organic photovoltaics, ferroelectrics, or organic electronics in general.

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