

University of Groningen

Multiscale modeling of organic materials

Alessandri, Riccardo

DOI:
[10.33612/diss.98150035](https://doi.org/10.33612/diss.98150035)

IMPORTANT NOTE: You are advised to consult the publisher's version (publisher's PDF) if you wish to cite from it. Please check the document version below.

Document Version
Publisher's PDF, also known as Version of record

Publication date:
2019

[Link to publication in University of Groningen/UMCG research database](#)

Citation for published version (APA):
Alessandri, R. (2019). *Multiscale modeling of organic materials: from the Morphology Up*. University of Groningen. <https://doi.org/10.33612/diss.98150035>

Copyright

Other than for strictly personal use, it is not permitted to download or to forward/distribute the text or part of it without the consent of the author(s) and/or copyright holder(s), unless the work is under an open content license (like Creative Commons).

The publication may also be distributed here under the terms of Article 25fa of the Dutch Copyright Act, indicated by the "Taverne" license. More information can be found on the University of Groningen website: <https://www.rug.nl/library/open-access/self-archiving-pure/taverne-amendment>.

Take-down policy

If you believe that this document breaches copyright please contact us providing details, and we will remove access to the work immediately and investigate your claim.

Downloaded from the University of Groningen/UMCG research database (Pure): <http://www.rug.nl/research/portal>. For technical reasons the number of authors shown on this cover page is limited to 10 maximum.

Bibliography

- [1] P. G. de Gennes, *Soft matter*, *Rev. Mod. Phys.*, **1992**, *64*, 645.
- [2] R. A. Jones, *Soft condensed matter* (Oxford University Press, 2002).
- [3] G. Schwartz, B. C.-K. Tee, J. Mei, A. L. Appleton, D. H. Kim, H. Wang, and Z. Bao, *Flexible polymer transistors with high pressure sensitivity for application in electronic skin and health monitoring*, *Nat. Commun.*, **2013**, *4*, 1859.
- [4] B. Russ, A. Glauzell, J. J. Urban, M. L. Chabiny, and R. A. Segalman, *Organic thermoelectric materials for energy harvesting and temperature control*, *Nat. Rev. Mater.*, **2016**, *1*, 16050.
- [5] M. Kaltenbrunner, M. S. White, E. D. Głowacki, T. Sekitani, T. Someya, N. S. Sariciftci, and S. Bauer, *Ultrathin and light-weight organic solar cells with high flexibility*, *Nat. Commun.*, **2012**, *3*, 770.
- [6] E. Hückel, *Quantentheoretische beiträge zum benzolproblem*, *Zeit. für Physik*, **1931**, *70*, 204.
- [7] S. D. Collins, N. A. Ran, M. C. Heiber, and T.-Q. Nguyen, *Small is powerful: recent progress in solution-processed small molecule solar cells*, *Adv. Energy Mater.*, **2017**, *7*, 1602242.
- [8] A. Facchetti, *π -conjugated polymers for organic electronics and photovoltaic cell applications*, *Chem. Mater.*, **2011**, *23*, 733.
- [9] C. J. Brabec, M. Heeney, I. McCulloch, and J. Nelson, *Influence of blend microstructure on bulk heterojunction organic photovoltaic performance*, *Chem. Soc. Rev.*, **2011**, *40*, 1185.
- [10] Y. Huang, E. J. Kramer, A. J. Heeger, and G. C. Bazan, *Bulk heterojunction solar cells: morphology and performance relationships*, *Chem. Rev.*, **2014**, *114*, 7006.
- [11] C. J. Brabec, N. S. Sariciftci, and J. C. Hummelen, *Plastic solar cells*, *Adv. Funct. Mater.*, **2001**, *11*, 15.
- [12] R. Steim, T. Ameri, P. Schilinsky, C. Waldauf, G. Dennler, M. Scharber, and C. J. Brabec, *Organic photovoltaics for low light applications*, *Sol. Energy Mater. Sol. Cells*, **2011**, *95*, 3256.

- [13] H. K. H. Lee, Z. Li, J. R. Durrant, and W. C. Tsoi, *Is organic photovoltaics promising for indoor applications?* *App. Phys. Lett.*, **2016**, *108*, 253301.
- [14] G. H. Gelinck, H. E. A. Huitema, E. van Veenendaal, E. Cantatore, L. Schrijnemakers, J. B. van der Putten, T. C. Geuns, M. Beenhakkers, J. B. Giesbers, B.-H. Huisman, *et al.*, *Flexible active-matrix displays and shift registers based on solution-processed organic transistors*, *Nat. Mater.*, **2004**, *3*, 106.
- [15] J. Rivnay, S. Inal, A. Salleo, R. M. Owens, M. Berggren, and G. G. Malliaras, *Organic electrochemical transistors*, *Nat. Rev. Mater.*, **2018**, *3*, 17086.
- [16] J. Nelson, J. J. Kwiatkowski, J. Kirkpatrick, and J. M. Frost, *Modeling charge transport in organic photovoltaic materials*, *Acc. Chem. Res.*, **2009**, *42*, 1768.
- [17] S. Kouijzer, J. J. Michels, M. van den Berg, V. S. Gevaerts, M. Turbiez, M. M. Wienk, and R. A. J. Janssen, *Predicting morphologies of solution processed polymer:fullerene blends*, *J. Am. Chem. Soc.*, **2013**, *135*, 12057.
- [18] V. Negi, O. Wodo, J. J. van Franeker, R. A. J. Janssen, and P. A. Bobbert, *Simulating phase separation during spin coating of a polymer–fullerene blend: a joint computational and experimental investigation*, *ACS Appl. Energy Mater.*, **2018**, *1*, 725.
- [19] D. Frenkel and B. Smit, *Understanding molecular simulation: from algorithms to applications*, 2nd ed. (Elsevier, 2002).
- [20] W. F. van Gunsteren, D. Bakowies, R. Baron, I. Chandrasekhar, M. Christen, X. Daura, P. Gee, D. P. Geerke, A. Glättli, P. H. Hünenberger, M. A. Kastenholtz, C. Oostenbrink, M. Schenk, D. Trzesniak, N. F. A. van der Vegt, and H. B. Yu, *Biomolecular modeling: Goals, problems, perspectives*, *Angew. Chem. Int. Ed.*, **2006**, *45*, 4064.
- [21] S. Riniker, *Fixed-charge atomistic force fields for molecular dynamics simulations in the condensed phase: an overview*, *J. Chem. Inf. Model.*, **2018**, *58*, 565.
- [22] J. E. Jones, *On the determination of molecular fields. —II. From the equation of state of a gas*, *Proc. R. Soc. Lond. A*, **1924**, *106*, 463.
- [23] A. Szabo and N. S. Ostlund, *Modern quantum chemistry: introduction to advanced electronic structure theory* (Dover Publications, 1996).
- [24] G. S. Ayton, W. G. Noid, and G. A. Voth, *Multiscale modeling of biomolecular systems: in serial and in parallel*, *Curr. Opin. Struct. Biol.*, **2007**, *17*, 192.
- [25] A. Warshel and M. Levitt, *Theoretical studies of enzymic reactions: dielectric, electrostatic and steric stabilization of the carbonium ion in the reaction of lysozyme*, *Journal of Molecular Biology*, **1976**, *103*, 227.
- [26] H. M. Senn and W. Thiel, *QM–MM methods for biomolecular systems*, *Angew. Chem. Int. Ed.*, **2019**, *48*, 1198.
- [27] G. A. Voth, *Coarse-graining of condensed phase and biomolecular systems* (CRC press, 2008).

-
- [28] D. M. Huang, R. Faller, K. Do, and A. J. Moulé, *Coarse-grained computer simulations of polymer/fullerene bulk heterojunctions for organic photovoltaic applications*, *J. Chem. Theory Comput.*, **2010**, *6*, 526.
- [29] T. A. Wassenaar, K. Pluhackova, R. A. Böckmann, S. J. Marrink, and D. P. Tieleman, *Going backward: a flexible geometric approach to reverse transformation from coarse grained to atomistic models*, *J. Chem. Theory Comput.*, **2014**, *10*, 676.
- [30] P. Gemünden, C. Poelking, K. Kremer, D. Andrienko, and K. C. Daoulas, *Nematic ordering, conjugation, and density of states of soluble polymeric semiconductors*, *Macromolecules*, **2013**, *46*, 5762.
- [31] S. Grimme, *A general quantum mechanically derived force field (QMDF) for molecules and condensed phase simulations*, *J. Chem. Theory Comput.*, **2014**, *10*, 4497.
- [32] A. E. A. Allen, M. C. Payne, and D. J. Cole, *Harmonic force constants for molecular mechanics force fields via hessian matrix projection*, *J. Chem. Theory and Comput.*, **2018**, *14*, 274.
- [33] K. Do, M. K. Ravva, T. Wang, and J.-L. Brédas, *Computational methodologies for developing structure–morphology–performance relationships in organic solar cells: A protocol review*, *Chem. Mater.*, **2016**, *29*, 346.
- [34] Y. Olivier, J.-C. Sancho-Garcia, L. Muccioli, G. D'Avino, and D. Beljonne, *Computational design of thermally activated delayed fluorescence materials: the challenges ahead*, *J. Phys. Chem. Lett.*, **2018**, *9*, 6149.
- [35] M. L. Klein and W. Shinoda, *Large-scale molecular dynamics simulations of self-assembling systems*, *Science*, **2008**, *321*, 798.
- [36] W. G. Noid, *Perspective: coarse-grained models for biomolecular systems*, *J. Chem. Phys.*, **2013**, *139*, 090901.
- [37] H. I. Ingólfsson, C. A. López, J. J. Uusitalo, D. H. de Jong, S. M. Gopal, X. Periole, and S. J. Marrink, *The power of coarse graining in biomolecular simulations*, *WIREs Comput. Mol. Sci.*, **2014**, *4*, 225.
- [38] S. J. Marrink and D. P. Tieleman, *Perspective on the Martini model*, *Chem. Soc. Rev.*, **2013**, *42*, 6801.
- [39] S. J. Marrink, H. J. Risselada, S. Yefimov, D. P. Tieleman, and A. H. de Vries, *The MARTINI force field: coarse grained model for biomolecular simulations*, *J. Phys. Chem. B*, **2007**, *111*, 7812.
- [40] H. I. Ingólfsson, M. N. Melo, F. J. van Eerden, C. Arnarez, C. A. López, T. A. Wassenaar, X. Periole, A. H. de Vries, D. P. Tieleman, and S. J. Marrink, *Lipid organization of the plasma membrane*, *J. Am. Chem. Soc.*, **2014**, *136*, 14554.

- [41] F. J. Van Eerden, M. N. Melo, P. W. Frederix, X. Periole, and S. J. Marrink, *Exchange pathways of plastoquinone and plastoquinol in the photosystem II complex*, *Nat. Commun.*, **2017**, *8*, 15214.
- [42] M. D'Agostino, H. J. Risselada, A. Lürick, C. Ungermann, and A. Mayer, *A tethering complex drives the terminal stage of SNARE-dependent membrane fusion*, *Nature*, **2017**, *551*, 634.
- [43] G. Rossi, L. Monticelli, S. R. Puisto, I. Vattulainen, and T. Ala-Nissila, *Coarse-graining polymers with the MARTINI force-field: polystyrene as a benchmark case*, *Soft Matter*, **2011**, *7*, 698.
- [44] L. Monticelli, *On atomistic and coarse-grained models for C₆₀ fullerene*, *J. Chem. Theory Comput.*, **2012**, *8*, 1370.
- [45] M. Lelimosin and M. S. P. Sansom, *Membrane perturbation by carbon nanotube insertion: pathways to internalization*, *Small*, **2013**, *9*, 3639.
- [46] M. Vögele, C. Holm, and J. Smiatek, *Coarse-grained simulations of poly-electrolyte complexes: MARTINI models for poly(styrene sulfonate) and poly(diallyldimethylammonium)*, *J. Chem. Phys.*, **2015**, *143*, 243151.
- [47] T. Winands, M. Bockmann, T. Schemme, P.-M. T. Ly, D. H. de Jong, Z. Wang, C. Denz, A. Heuer, and N. L. Doltsinis, *P3HT:DiPBI bulk heterojunction solar cells: morphology and electronic structure probed by multiscale simulation and UV/Vis spectroscopy*, *Phys. Chem. Chem. Phys.*, **2016**, *18*, 6217.
- [48] M. J. Abraham, T. Murtola, R. Schulz, S. Páll, J. C. Smith, B. Hess, and E. Lindahl, *GROMACS: high performance molecular simulations through multi-level parallelism from laptops to supercomputers*, *SoftwareX*, **2015**, *1*, 19.
- [49] J. C. Phillips, R. Braun, W. Wang, J. Gumbart, E. Tajkhorshid, E. Villa, C. Chipot, R. D. Skeel, L. Kalé, and K. Schulten, *Scalable molecular dynamics with NAMD*, *J. Comput. Chem.*, **2005**, *26*, 1781.
- [50] J. Wang, R. M. Wolf, J. W. Caldwell, P. A. Kollman, and D. A. Case, *Development and testing of a general amber force field*, *J. Comput. Chem.*, **2004**, *25*, 1157.
- [51] K. Vanommeslaeghe, E. Hatcher, C. Acharya, S. Kundu, S. Zhong, J. Shim, E. Darian, O. Guvench, P. Lopes, I. Vorobyov, and A. D. Mackerell Jr., *CHARMM general force field: a force field for drug-like molecules compatible with the CHARMM all-atom additive biological force fields*, *J. Comput. Chem.*, **2010**, *31*, 671.
- [52] C. Oostenbrink, A. Villa, A. E. Mark, and W. F. van Gunsteren, *A biomolecular force field based on the free enthalpy of hydration and solvation: the GROMOS force-field parameter sets 53A5 and 53A6*, *J. Comput. Chem.*, **2004**, *25*, 1656.
- [53] W. L. Jorgensen, D. S. Maxwell, and J. Tirado-Rives, *Development and testing of the OPLS all-atom force field on conformational energetics and properties of organic liquids*, *J. Am. Chem. Soc.*, **1996**, *118*, 11225.

-
- [54] M. G. Martin and J. I. Siepmann, *Transferable potentials for phase equilibria. 1. United-atom description of n-alkanes*, *J. Phys. Chem. B*, **1998**, *102*, 2569.
- [55] H. Sun, *COMPASS: an ab initio force-field optimized for condensed-phase applications—overview with details on alkane and benzene compounds*, *J. Phys. Chem. B*, **1998**, *102*, 7338.
- [56] J. T. Horton, A. E. A. Allen, L. S. Dodda, and D. J. Cole, *QUBEKit: automating the derivation of force field parameters from quantum mechanics*, *J. Chem. Inf. Model.*, **2019**, *59*, 1366.
- [57] S. Sami and co-workers, *Q-Force*, in preparation.
- [58] D. Mobley, C. C. Bannan, A. Rizzi, C. I. Bayly, J. D. Chodera, V. T. Lim, N. M. Lim, K. A. Beauchamp, M. R. Shirts, M. K. Gilson, and P. K. Eastman, *Open Force Field Consortium: escaping atom types using direct chemical perception with SMIRNOFF v0.1*, *bioRxiv*, **2018**, .
- [59] G. D'Avino, L. Muccioli, C. Zannoni, D. Beljonne, and Z. G. Soos, *Electronic polarization in organic crystals: a comparative study of induced dipoles and intramolecular charge redistribution schemes*, *J. Chem. Theory Comput.*, **2014**, *10*, 4959.
- [60] P. T. van Duijnen, H. D. de Gier, R. Broer, and R. W. Havenith, *The behaviour of charge distributions in dielectric media*, *Chem. Phys. Lett.*, **2014**, *615*, 83.
- [61] S. Few, J. M. Frost, and J. Nelson, *Models of charge pair generation in organic solar cells*, *Phys. Chem. Chem. Phys.*, **2015**, *17*, 2311.
- [62] G. D'Avino, L. Muccioli, F. Castet, C. Poelking, D. Andrienko, Z. G. Soos, J. Cornil, and D. Beljonne, *Electrostatic phenomena in organic semiconductors: fundamentals and implications for photovoltaics*, *J. Phys. Condens. Matter*, **2016**, *28*, 433002.
- [63] S. M. Ryno, M. K. Ravva, X. Chen, H. Li, and J.-L. Brédas, *Molecular understanding of fullerene–electron donor interactions in organic solar cells*, *Adv. Energy Mater.*, **2017**, *7*, 1601370.
- [64] M. Swart and P. T. van Duijnen, *DRF90: a polarizable force field*, *Mol. Simul.*, **2006**, *32*, 471.
- [65] S. M. Ryno, S. R. Lee, J. S. Sears, C. Risko, and J.-L. Brédas, *Electronic polarization effects upon charge injection in oligoacene molecular crystals: description via a polarizable force field*, *J. Phys. Chem. C*, **2013**, *117*, 13853.
- [66] N. Sato, K. Seki, and H. Inokuchi, *Polarization energies of organic solids determined by ultraviolet photoelectron spectroscopy*, *J. Chem. Soc. Faraday Trans. 2*, **1981**, *77*, 1621.
- [67] N. Sato, H. Inokuchi, and E. A. Silinsh, *Reevaluation of electronic polarization energies in organic molecular crystals*, *Chem. Phys.*, **1987**, *115*, 269.

- [68] S. Verlaak, D. Beljonne, D. Cheyns, C. Rolin, M. Linares, F. Castet, J. Cornil, and P. Heremans, *Electronic structure and geminate pair energetics at organic–organic interfaces: the case of pentacene/C₆₀ heterojunctions*, *Adv. Funct. Mater.*, **2009**, *19*, 3809.
- [69] N. Gorczak, M. Swart, and F. C. Grozema, *Energetics of charges in organic semiconductors and at organic donor–acceptor interfaces*, *J. Mater. Chem. C*, **2014**, *2*, 3467.
- [70] G. D'Avino, S. Mothy, L. Muccioli, C. Zannoni, L. Wang, J. Cornil, D. Beljonne, and F. Castet, *Energetics of electron–hole separation at P3HT/PCBM heterojunctions*, *J. Phys. Chem. C*, **2013**, *117*, 12981.
- [71] B. T. Thole and P. T. van Duijnen, *A general population analysis preserving the dipole moment*, *Theor. Chim. Acta*, **1983**, *63*, 209.
- [72] P. T. Van Duijnen and M. Swart, *Molecular and atomic polarizabilities: Thole's model revisited*, *J. Phys. Chem. A*, **1998**, *102*, 2399.
- [73] B. T. Thole, *Molecular polarizabilities calculated with a modified dipole interaction*, *Chem. Phys.*, **1981**, *59*, 341.
- [74] P. Ren and J. W. Ponder, *Polarizable atomic multipole water model for molecular mechanics simulation*, *J. Phys. Chem. B*, **2003**, *107*, 5933.
- [75] R. M. Martin, *Electronic structure: basic theory and practical methods* (Cambridge university press, 2004).
- [76] W. Kohn and L. J. Sham, *Self-consistent equations including exchange and correlation effects*, *Phys. Rev.*, **1965**, *140*, A1133.
- [77] P. J. Stephens, E. J. Devlin, C. F. Chabalowski, and M. J. Frisch, *Ab initio calculation of vibrational absorption and circular dichroism spectra using density functional force fields*, *J. Phys. Chem.*, **1994**, *98*, 11623.
- [78] T. Körzdörfer and J.-L. Brédas, *Organic electronic materials: Recent advances in the dft description of the ground and excited states using tuned range-separated hybrid functionals*, *Acc. Chem. Res.*, **2014**, *47*, 3284.
- [79] J.-D. Chai and M. Head-Gordon, *Long-range corrected hybrid density functionals with damped atom–atom dispersion corrections*, *Phys. Chem. Chem. Phys.*, **2008**, *10*, 6615.
- [80] M. Elstner, D. Porezag, G. Jungnickel, J. Elsner, M. Haugk, T. Frauenheim, S. Suhai, and G. Seifert, *Self-consistent-charge density-functional tight-binding method for simulations of complex materials properties*, *Phys. Rev. B*, **1998**, *58*, 7260.
- [81] D. Porezag, T. Frauenheim, T. Köhler, G. Seifert, and R. Kaschner, *Construction of tight-binding-like potentials on the basis of density-functional theory: application to carbon*, *Phys. Rev. B*, **1995**, *51*, 12947.

-
- [82] T. Frauenheim, G. Seifert, M. Elsterner, Z. Hajnal, G. Jungnickel, D. Porezag, S. Suhai, and R. Scholz, *A self-consistent charge density-functional based tight-binding method for predictive materials simulations in physics, chemistry and biology*, *Phys. Status Solidi (b)*, **2000**, *217*, 41.
- [83] R. Scholz, R. Luschtinetz, G. Seifert, T. Jägeler-Hoheisel, C. K. anKarl Leo, and M. Rapacioli, *Quantifying charge transfer energies at donor–acceptor interfaces in small-molecule solar cells with constrained dftb and spectroscopic methods*, *J. Phys.: Condens. Matter*, **2013**, *25*, 473201.
- [84] A. A. M. H. M. Darghouth, M. E. Casida, W. Taouali, K. Alimi, M. P. Ljungberg, P. Koval, D. Sánchez-Portal, and D. Foerster, *Assessment of density-functional tight-binding ionization potentials and electron affinities of molecules of interest for organic solar cells against first-principles gw calculations*, *Computation*, **2015**, *3*, 616.
- [85] J. Pople and D. Beveridge, *Approximate molecular orbital theory*, McGraw-Hill series in advanced chemistry (McGraw-Hill, 1970).
- [86] W. Thiel, *Semiempirical quantum–chemical methods*, *WIREs Comput. Mol. Sci.*, **2014**, *4*, 145.
- [87] P. O. Dral, X. Wu, L. Spörkel, A. Koslowski, and W. Thiel, *Semiempirical quantum-chemical orthogonalization-corrected methods: benchmarks for ground-state properties*, *J. Chem. Theory Comput.*, **2016**, *12*, 1097.
- [88] M. R. Lee, R. D. Eckert, K. Forberich, G. Dennler, C. J. Brabec, and R. A. Gaudiana, *Solar power wires based on organic photovoltaic materials*, *Science*, **2009**, *324*, 232.
- [89] G. Yu, J. Gao, J. C. Hummelen, F. Wudl, and A. J. Heeger, *Polymer photovoltaic cells: enhanced efficiencies via a network of internal donor-acceptor heterojunctions*, *Science*, **1995**, *270*, 1789.
- [90] J. J. M. Halls, C. A. Walsh, N. C. Greenham, E. A. Marseglia, R. H. Friend, S. C. Moratti, and A. B. Holmes, *Efficient photodiodes from interpenetrating polymer networks*, *Nature*, **1995**, *376*, 498.
- [91] M. C. Scharber, D. Muhlbacher, M. Koppe, P. Denk, C. Waldauf, A. J. Heeger, and C. J. Brabec, *Design rules for donors in bulk-heterojunction solar cells-towards 10% energy-conversion efficiency*, *Adv. Mater.*, **2006**, *18*, 789.
- [92] N. E. Jackson, B. M. Savoie, T. J. Marks, L. X. Chen, and M. A. Ratner, *The next breakthrough for organic photovoltaics?* *J. Phys. Chem. Lett.*, **2015**, *6*, 77.
- [93] M. C. Scharber, *On the efficiency limit of conjugated polymer:fullerene-based bulk heterojunction solar cells*, *Adv. Mater.*, **2016**, *28*, 1994.
- [94] T. M. Clarke and J. R. Durrant, *Charge photogeneration in organic solar cells*, *Chem. Rev.*, **2010**, *110*, 6736.

- [95] D. Chirvase, J. Parisi, J. C. Hummelen, and V. Dyakonov, *Influence of morphology on the photovoltaic action of polymer–fullerene composites*, *Nanotechnology*, **2004**, *15*, 1317.
- [96] S. E. Shaheen, C. J. Brabec, N. S. Sariciftci, F. Padinger, T. Fromherz, and J. C. Hummelen, *2.5% efficient organic plastic solar cells*, *Appl. Phys. Lett.*, **2001**, *78*, 841.
- [97] F. Zhang, K. G. Jespersen, C. Bjoerstroem, M. Svensson, M. R. Andersson, V. Sundström, K. Magnusson, E. Moons, A. Yartsev, and O. Inganäs, *Influence of solvent mixing on the morphology and performance of solar cells based on polyfluorene copolymer/fullerene blends*, *Adv. Funct. Mater.*, **2006**, *16*, 667.
- [98] G. Li, V. Shrotriya, J. Huang, Y. Yao, T. Moriarty, K. Emery, and Y. Yang, *High-efficiency solution processable polymer photovoltaic cells by self-organization of polymer blends*, *Nat. Mater.*, **2005**, *4*, 864.
- [99] F. Padinger, R. S. Rittberger, and N. S. Sariciftci, *Effects of postproduction treatment on plastic solar cells*, *Adv. Funct. Mater.*, **2003**, *13*, 85.
- [100] H. Hoppe, M. Niggemann, C. Winder, J. Kraut, R. Hiesgen, A. Hinsch, D. Meissner, and N. S. Sariciftci, *Nanoscale morphology of conjugated polymer/fullerene-based bulk-heterojunction solar cells*, *Adv. Funct. Mater.*, **2004**, *14*, 1005.
- [101] C. Y. Yang and A. J. Heeger, *Morphology of composites of semiconducting polymers mixed with C₆₀*, *Synth. Met.*, **1996**, *83*, 85.
- [102] X. Yang, J. Loos, S. C. Veenstra, W. J. H. Verhees, M. M. Wienk, J. M. Kroon, M. A. J. Michels, and R. A. J. Janssen, *Nanoscale morphology of high-performance polymer solar cells*, *Nano Lett.*, **2005**, *5*, 579.
- [103] S. S. van Bavel, E. Sourty, and J. Loos, *Three-dimensional nanoscale organization of bulk heterojunction polymer solar cells*. *Nano Lett.*, **2009**, *9*, 507.
- [104] Y. Kim, S. Cook, S. M. Tuladhar, S. A. Choulis, J. Nelson, J. R. Durrant, D. D. C. Bradley, M. Giles, I. McCulloch, C.-S. Ha, and M. Ree, *A strong regioregularity effect in self-organizing conjugated polymer films and high-efficiency polythiophene:fullerene solar cells*, *Nat. Mater.*, **2006**, *5*, 197.
- [105] W.-R. Wu, U.-S. Jeng, C.-J. Su, K.-H. Wei, M.-S. Su, M.-Y. Chiu, C.-Y. Chen, W.-B. Su, C.-H. Su, and A.-C. Su, *Competition between fullerene aggregation and poly(3-hexylthiophene) crystallization upon annealing of bulk heterojunction solar cells*, *ACS Nano*, **2011**, *5*, 6233.
- [106] C.-K. Lee, C.-W. Pao, and C.-W. Chu, *Multiscale molecular simulations of the nanoscale morphologies of P3HT:PCBM blends for bulk heterojunction organic photovoltaic cells*, *Energy Environ. Sci.*, **2011**, *4*, 4124.
- [107] E. Jankowski, H. S. Marsh, and A. Jayaraman, *Computationally linking molecular features of conjugated polymers and fullerene derivatives to bulk heterojunction morphology*, *Macromolecules*, **2013**, *46*, 5775.

-
- [108] T. To and S. Adams, *Modelling of P3HT:PCBM interface using coarse-grained force-field derived from accurate atomistic forcefield*, *Phys. Chem. Chem. Phys.*, **2014**, *16*, 4653.
- [109] J.-M. Y. Carrillo, Z. Seibers, R. Kumar, M. A. Matheson, J. F. Ankner, M. Goswami, K. Bhaskaran-Nair, W. A. Shelton, B. G. Sumpter, and S. M. Kilbey, *Petascale simulations of the morphology and the molecular interface of bulk heterojunctions*, *ACS Nano*, **2016**, *10*, 7008.
- [110] P. Peumans, S. Uchida, and S. R. Forrest, *Efficient bulk heterojunction photovoltaic cells using small-molecular-weight organic thin films*, *Nature*, **2003**, *425*, 158.
- [111] L. J. A. Koster, *Charge carrier mobility in disordered organic blends for photovoltaics*, *Phys. Rev. B*, **2010**, *81*, 205318.
- [112] T. Moench, P. Friederich, F. Holzmueller, B. Rutkowski, J. Benduhn, T. Strunk, C. Koerner, K. Vandewal, A. Czyrska-Filemonowicz, W. Wenzel, and K. Leo, *Influence of meso and nanoscale structure on the properties of highly efficient small molecule solar cells*, *Adv. Energy Mater.*, **2016**, *6*, 1051280.
- [113] S. R. Yost, L.-P. Wang, and T. Van Voorhis, *Molecular insight into the energy levels at the organic donor/acceptor interface: a quantum mechanics/molecular mechanics study*, *J. Phys. Chem. C*, **2011**, *115*, 14431.
- [114] T. Liu and A. Troisi, *Absolute rate of charge separation and recombination in a molecular model of the P3HT/PCBM interface*, *J. Phys. Chem. C*, **2011**, *115*, 2406.
- [115] H. D. de Gier, R. Broer, and R. W. A. Havenith, *Non-innocent side-chains with dipole moments in organic solar cells improve charge separation*, *Phys. Chem. Chem. Phys.*, **2014**, *16*, 12454.
- [116] C.-K. Lee and C.-W. Pao, *Nanomorphology evolution of P3HT:PCBM blends during solution-processing from coarse-grained molecular simulations*, *J. Phys. Chem. C*, **2014**, *118*, 11224.
- [117] R. Alessandri, J. J. Uusitalo, A. H. de Vries, R. W. A. Havenith, and S. J. Marrink, *Bulk heterojunction morphologies with atomistic resolution from coarse-grain solvent evaporation simulations*, *J. Am. Chem. Soc.*, **2017**, *139*, 3697.
- [118] R. C. Masters, A. J. Pearson, T. S. Glen, F.-C. Sasam, L. Li, M. Dapor, A. M. Donald, D. G. Lidzey, and C. Rodenburg, *Sub-nanometre resolution imaging of polymer-fullerene photovoltaic blends using energy-filtered scanning electron microscopy*, *Nat. Commun.*, **2015**, *6*, 6928.
- [119] F. Machui, S. Langner, X. Zhu, S. Abbott, and C. J. Brabec, *Determination of the P3HT:PCBM solubility parameters via a binary solvent gradient method: impact of solubility on the photovoltaic performance*, *Sol. Energ. Mat. Sol. Cells*, **2012**, *100*, 138.

- [120] L. J. Richter, D. M. DeLongchamp, F. A. Bokel, S. Engmann, K. W. Chou, A. Amassian, E. Schaible, and A. Hexemer, *In situ morphology studies of the mechanism for solution additive effects on the formation of bulk heterojunction films*, *Adv. Energy Mater.*, **2015**, *5*, 1400975.
- [121] S. Pröller, F. Liu, C. Zhu, C. Wang, T. P. Russell, A. Hexemer, P. Müller-Buschbaum, and E. M. Herzig, *Following the morphology formation in situ in printed active layers for organic solar cells*, *Adv. Energy Mater.*, **2016**, *6*, 1501580.
- [122] X. Gu, H. Yan, T. Kurosawa, B. C. Schroeder, K. L. Gu, Y. Zhou, J. W. F. To, S. D. Oosterhout, V. Savikhin, F. Molina-Lopez, C. J. Tassone, S. C. B. Mannsfeld, C. Wang, M. F. Toney, and Z. Bao, *Comparison of the morphology development of polymer-fullerene and polymer-polymer solar cells during solution-shearing blade coating*, *Adv. Energy Mater.*, **2016**, *6*, 1601225.
- [123] G. Li, Y. Yao, H. Yang, V. Shrotriya, G. Yang, and Y. Yang, "Solvent annealing" effect in polymer solar cells based on poly (3-hexylthiophene) and methanofullerenes, *Adv. Funct. Mater.*, **2007**, *17*, 1636.
- [124] F. Liu, D. Chen, C. Wang, K. Luo, W. Gu, A. L. Briseno, J. W. P. Hsu, and T. P. Russell, *Molecular weight dependence of the morphology in P3HT:PCBM solar cells*, *ACS App. Mater. Inter.*, **2014**, *6*, 19876.
- [125] M.-C. Shih, B.-C. Huang, C.-C. Lin, S.-S. Li, H.-A. Chen, Y.-P. Chiu, and C.-W. Chen, *Atomic-scale interfacial band mapping across vertically phase-separated polymer/fullerene hybrid solar cells*, *Nano Lett.*, **2013**, *13*, 2387.
- [126] Y.-W. Su, M.-Y. Chiu, and K.-H. Wei, *Nano-scale morphology for bulk heterojunction polymer solar cells*, in *Progress in High-Efficient Solution Process Organic Photovoltaic Devices: Fundamentals, Materials, Devices and Fabrication*, edited by Y. Yang and G. Li (Springer Berlin Heidelberg, Berlin, Heidelberg, 2015) pp. 251–271.
- [127] T. Erb, U. Zhokhavets, G. Gobsch, S. Raleva, B. Stühn, P. Schilinsky, C. Waldauf, and C. J. Brabec, *Correlation between structural and optical properties of composite polymer/fullerene films for organic solar cells*, *Adv. Funct. Mater.*, **2005**, *15*, 1193.
- [128] J. Jo, S.-I. Na, S.-S. Kim, T.-W. Lee, Y. Chung, S.-J. Kang, D. Vak, and D.-Y. Kim, *Three-dimensional bulk heterojunction morphology for achieving high internal quantum efficiency in polymer solar cells*, *Adv. Funct. Mater.*, **2009**, *19*, 2398.
- [129] N. D. Treat, M. A. Brady, G. Smith, M. F. Toney, E. J. Kramer, C. J. Hawker, and M. L. Chabiny, *Interdiffusion of PCBM and P3HT reveals miscibility in a photovoltaically active blend*, *Adv. Energy Mater.*, **2011**, *1*, 82.
- [130] M.-Y. Chiu, U.-S. Jeng, C.-H. Su, K. S. Liang, and K.-H. Wei, *Simultaneous use of small- and wide-angle X-ray techniques to analyze nanometerscale phase separation in polymer heterojunction solar cells*, *Adv. Mater.*, **2008**, *20*, 2573.

-
- [131] M. Brinkmann and J.-C. Wittmann, *Orientation of regioregular poly (3-hexylthiophene) by directional solidification: a simple method to reveal the semicrystalline structure of a conjugated polymer*, *Adv. Mater.*, **2006**, *18*, 860.
- [132] R. J. Kline, M. D. McGehee, E. N. Kadnikova, J. Liu, J. M. J. Fréchet, and M. F. Toney, *Dependence of regioregular poly (3-hexylthiophene) film morphology and field-effect mobility on molecular weight*, *Macromolecules*, **2005**, *38*, 3312.
- [133] N. R. Tummala, C. Risko, C. Bruner, R. H. Dauskardt, and J.-L. Brédas, *Entanglements in P3HT and their influence on thin-film mechanical properties: insights from molecular dynamics simulations*, *J. Polym. Sci. Part B Polym. Phys.*, **2015**, *53*, 934.
- [134] H. Sirringhaus, P. J. Brown, R. H. Friend, M. M. Nielsen, K. Bechgaard, B. M. W. Langeveld-Voss, A. J. H. Spiering, R. A. J. Janssen, E. W. Meijer, P. Herwig, and D. M. de Leeuw, *Two-dimensional charge transport in self-organized, high-mobility conjugated polymers*, *Nature*, **1999**, *401*, 685.
- [135] T. Liu, D. L. Cheung, and A. Troisi, *Structural variability and dynamics of the P3HT/PCBM interface and its effects on the electronic structure and the charge-transfer rates in solar cells*, *Phys. Chem. Chem. Phys.*, **2011**, *13*, 21461.
- [136] L. J. A. Koster, S. E. Shaheen, and J. C. Hummelen, *Pathways to a new efficiency regime for organic solar cells*, *Adv. Energy Mater.*, **2012**, *2*, 1246.
- [137] H. D. de Gier, F. Jahani, R. Broer, J. C. Hummelen, and R. W. A. Havenith, *Promising strategy to improve charge separation in organic photovoltaics: installing permanent dipoles in PCBM analogues*, *J. Phys. Chem. A*, **2016**, *120*, 4664.
- [138] N. R. Tummala, C. Bruner, C. Risko, J.-L. Brédas, and R. H. Dauskardt, *Molecular-scale understanding of cohesion and fracture in P3HT:fullerene blends*, *ACS Appl. Mater. Inter.*, **2015**, *7*, 9957.
- [139] S. E. Root, S. Savagatrup, C. J. Pais, G. Arya, and D. J. Lipomi, *Predicting the mechanical properties of organic semiconductors using coarse-grained molecular dynamics simulations*, *Macromolecules*, **2016**, *49*, 2886.
- [140] S. J. Marrink, A. H. de Vries, and A. E. Mark, *Coarse grained model for semiquantitative lipid simulations*, *J. Phys. Chem. B*, **2004**, *108*, 750.
- [141] L. Monticelli, S. K. Kandasamy, X. Periolo, R. G. Larson, D. P. Tieleman, and S. J. Marrink, *The MARTINI coarse-grained force field: extension to proteins*, *J. Chem. Theory Comput.*, **2008**, *4*, 819.
- [142] C. A. López, A. J. Rzepiela, A. H. de Vries, L. Dijkhuizen, P. H. Hünenberger, and S. J. Marrink, *Martini coarse-grained force field: extension to carbohydrates*, *J. Chem. Theory Comput.*, **2009**, *5*, 3195.
- [143] J. J. Uusitalo, H. I. Ingólfsson, P. Akhshi, D. P. Tieleman, and S. J. Marrink, *Martini coarse-grained force field: extension to DNA*, *J. Chem. Theory Comput.*, **2015**, *11*, 3932.

- [144] H. Lee, A. H. de Vries, S. J. Marrink, and R. W. Pastor, *A coarse-grained model for polyethylene oxide and polyethylene glycol: conformation and hydrodynamics*, *J. Phys. Chem. B*, **2009**, *113*, 13186.
- [145] E. Panizon, D. Bochicchio, L. Monticelli, and G. Rossi, *MARTINI coarse-grained models of polyethylene and polypropylene*, *J. Phys. Chem. B*, **2015**, *119*, 8209.
- [146] S. Baoukina, L. Monticelli, and D. P. Tieleman, *Interaction of pristine and functionalized carbon nanotubes with lipid membranes*, *J. Phys. Chem. B*, **2013**, *117*, 12113.
- [147] Q. Hu, B. Jiao, X. Shi, R. P. Valle, Y. Y. Zuo, and G. Hu, *Effects of graphene oxide nanosheets on the ultrastructure and biophysical properties of the pulmonary surfactant film*, *Nanoscale*, **2015**, *7*, 18025.
- [148] D. Janeliunas, *Self-Assembly of Facial Oligothiophene Amphiphiles* (Ph.D. Dissertation, TU Delft, Delft University of Technology, 2014).
- [149] L. Verlet, *Computer experiments on classical fluids. I. Thermodynamical properties of Lennard-Jones molecules*, *Phys. Rev.*, **1967**, *159*, 98.
- [150] D. H. de Jong, S. Baoukina, H. I. Ingólfsson, and S. J. Marrink, *Martini straight: boosting performance using a shorter cutoff and GPUs*, *Comput. Phys. Commun.*, **2016**, *199*, 1.
- [151] G. Bussi, D. Donadio, and M. Parrinello, *Canonical sampling through velocity rescaling*, *J. Chem. Phys.*, **2007**, *126*, 014101.
- [152] M. Parrinello and A. Rahman, *Polymorphic transitions in single crystals: a new molecular dynamics method*, *J. App. Phys.*, **1981**, *52*, 7182.
- [153] M. T. Dang, L. Hirsch, and G. Wantz, *P3HT:PCBM, best seller in polymer photovoltaic research*, *Adv. Mater.*, **2011**, *23*, 3597.
- [154] G. Kimminau, B. Nagler, A. Higginbotham, W. J. Murphy, N. Park, J. Hawreliak, K. Kadau, T. C. Germann, E. M. Bringa, D. H. Kalantar, H. E. Lorenzana, B. A. Remington, and J. S. Wark, *Simulating picosecond X-ray diffraction from shocked crystals using post-processing molecular dynamics calculations*, *J. Phys.: Condens. Matter*, **2008**, *20*, 505203.
- [155] N. Michaud-Agrawal, E. J. Denning, T. B. Woolf, and O. Beckstein, *MDAnalysis: a toolkit for the analysis of molecular dynamics simulations*, *J. Comput. Chem.*, **2011**, *32*, 2319.
- [156] R. J. Gowers, M. Linke, J. Barnoud, T. J. E. Reddy, M. N. Melo, S. L. Seyler, D. L. Dotson, J. Domanski, S. Buchoux, I. M. Kenney, and O. Beckstein, *MDAnalysis: a Python package for the rapid analysis of molecular dynamics simulations*, in *Proceedings of the 15th Python in Science Conference, Austin, TX*, edited by S. Benthall and S. Rostrup (SciPy, Scipy, 2016) pp. 102–109.

-
- [157] W. Humphrey, A. Dalke, and K. Schulten, *VMD: visual molecular dynamics*, *J. Mol. Graph.*, **1996**, *14*, 33.
- [158] J. Stone, *An Efficient Library for Parallel Ray Tracing and Animation* (Master's thesis, Computer Science Department, University of Missouri-Rolla, 1998).
- [159] M. Bulacu, N. Goga, W. Zhao, G. Rossi, L. Monticelli, X. Periole, D. P. Tieleman, and S. J. Marrink, *Improved angle potentials for coarse-grained molecular dynamics simulations*, *J. Chem. Theory Comput.*, **2013**, *9*, 3282.
- [160] <http://perso.ibcp.fr/luca.monticelli/MARTINI/index.html>.
- [161] C. W. T. Bulle-Lieuwma, W. J. H. van Gennip, J. K. J. van Duren, P. Jonkheijm, R. A. J. Janssen, and J. W. Niemantsverdriet, *Characterization of polymer solar cells by TOF-SIMS depth profiling*, *App. Surf. Sci.*, **2003**, *203*, 547.
- [162] W. Geens, T. Martens, J. Poortmans, T. Aernouts, J. Manca, L. Lutsen, P. Heremans, S. Borghs, R. Mertens, and D. Vanderzande, *Modelling the short-circuit current of polymer bulk heterojunction solar cells*, *Thin Solid Films*, **2004**, *451*, 498.
- [163] S. van Bavel, E. Sourty, G. de With, K. Frolic, and J. Loos, *Relation between photoactive layer thickness, 3D morphology, and device performance in P3HT/PCBM bulk-heterojunction solar cells*, *Macromolecules*, **2009**, *42*, 7396.
- [164] J. W. Kiel, B. J. Kirby, C. F. Majkrzak, B. B. Maranville, and M. E. Mackay, *Nanoparticle concentration profile in polymer-based solar cells*, *Soft Matter*, **2010**, *6*, 641.
- [165] A. K. Malde, L. Zuo, M. Breeze, M. Stroet, D. Poger, P. C. Nair, C. Oostenbrink, and A. E. Mark, *An automated force field topology builder (ATB) and repository: version 1.0*, *J. Chem. Theory Comput.*, **2011**, *7*, 4026.
- [166] M. F. Guest, I. J. Bush, H. J. J. van Dam, P. Sherwood, J. M. H. Thomas, J. H. van Lenthe, R. W. A. Havenith, and J. Kendrick, *The GAMESS-UK electronic structure package: algorithms, developments and applications*, *Mol. Phys.*, **2005**, *103*, 719.
- [167] S. B. Darling and M. Sternberg, *Importance of side chains and backbone length in defect modeling of poly (3-alkylthiophenes)*, *J. Phys. Chem. B*, **2009**, *113*, 6215.
- [168] L. A. Girifalco, *Molecular properties of fullerene in the gas and solid phases*, *J. Phys. Chem.*, **1992**, *96*, 858.
- [169] D. L. Cheung and A. Troisi, *Theoretical study of the organic photovoltaic electron acceptor PCBM: morphology, electronic structure, and charge localization*, *J. Phys. Chem. C*, **2010**, *114*, 20479.
- [170] D. R. Lide, *CRC Handbook of Chemistry and Physics* (CRC press, 2004).
- [171] M. R. Shirts and J. D. Chodera, *Statistically optimal analysis of samples from multiple equilibrium states*, *J. Chem. Phys.*, **2008**, *129*, 124105.

- [172] M. H. Abraham, H. S. Chadha, G. S. Whiting, and R. C. Mitchell, *Hydrogen bonding. 32. An analysis of water-octanol and water-alkane partitioning and the $\Delta \log P$ parameter of seiler*, *J. Pharm. Sci.*, **1994**, *83*, 1085.
- [173] A. Klamt, V. Jonas, T. Bürger, and J. C. W. Lohrenz, *Refinement and parametrization of COSMO-RS*, *J. Phys. Chem. A*, **1998**, *102*, 5074.
- [174] H. J. C. Berendsen, J. P. M. v. Postma, W. F. van Gunsteren, A. DiNola, and J. R. Haak, *Molecular dynamics with coupling to an external bath*, *J. Chem. Phys.*, **1984**, *81*, 3684.
- [175] S. Kumar, J. M. Rosenberg, D. Bouzida, R. H. Swendsen, and P. A. Kollman, *The weighted histogram analysis method for free-energy calculations on biomolecules. I. The method*, *J. Comput. Chem.*, **1992**, *13*, 1011.
- [176] L. Martínez, R. Andrade, E. G. Birgin, and J. M. Martínez, *PACKMOL: a package for building initial configurations for molecular dynamics simulations*, *J. Comput. Chem.*, **2009**, *30*, 2157.
- [177] I. Salzmann, G. Heimel, M. Oehzelt, S. Winkler, and N. Koch, *Molecular electrical doping of organic semiconductors: fundamental mechanisms and emerging dopant design rules*, *Acc. Chem. Res.*, **2016**, *49*, 370.
- [178] K. Kang, S. Watanabe, K. Broch, A. Sepe, A. Brown, I. Nasrallah, M. Nikolka, Z. Fei, M. Heeney, D. Matsumoto, K. Marumoto, H. Tanaka, S.-i. Kuroda, and H. Sirringhaus, *2D coherent charge transport in highly ordered conducting polymers doped by solid state diffusion*, *Nat. Mater.*, **2016**, *15*, 896.
- [179] B. Lüssem, M. Riede, and K. Leo, *Doping of organic semiconductors*, *Phys. Status Solidi (a)*, **2013**, *210*, 9.
- [180] G.-H. Kim, L. Shao, K. Zhang, and K. P. Pipe, *Engineered doping of organic semiconductors for enhanced thermoelectric efficiency*, *Nat. Mater.*, **2013**, *12*, 719.
- [181] G. Lu, J. Blakesley, S. Himmelberger, P. Pingel, J. Frisch, I. Lieberwirth, I. Salzmann, M. Oehzelt, R. Di Pietro, A. Salleo, N. Koch, and D. Neher, *Moderate doping leads to high performance of semiconductor/insulator polymer blend transistors*, *Nat. Commun.*, **2013**, *4*, 1588.
- [182] Y. Xuan, X. Liu, S. Desbief, P. Leclère, M. Fahlman, R. Lazzaroni, M. Berggren, J. Cornil, D. Emin, and X. Crispin, *Thermoelectric properties of conducting polymers: The case of poly (3-hexylthiophene)*, *Phys. Rev. B*, **2010**, *82*, 115454.
- [183] J. C. Duda, P. E. Hopkins, Y. Shen, and M. C. Gupta, *Thermal transport in organic semiconducting polymers*, *App. Phys. Lett.*, **2013**, *102*, 251912.
- [184] X. Wang, C. D. Liman, N. D. Treat, M. L. Chabynyc, and D. G. Cahill, *Ultralow thermal conductivity of fullerene derivatives*, *Phys. Rev. B*, **2013**, *88*, 075310.

-
- [185] I. E. Jacobs and A. J. Moulé, *Controlling molecular doping in organic semiconductors*, *Adv. Mater.*, **2017**, *29*, 1703063.
- [186] B. D. Naab, S. Guo, S. Olthof, E. G. B. Evans, P. Wei, G. L. Millhauser, A. Kahn, S. Barlow, S. R. Marder, and Z. Bao, *Mechanistic study on the solution-phase n-doping of 1,3-dimethyl-2-aryl-2,3-dihydro-1H-benzoimidazole derivatives*, *J. Am. Chem. Soc.*, **2013**, *135*, 15018.
- [187] K. Shi, F. Zhang, C.-A. Di, T.-W. Yan, Y. Zou, X. Zhou, D. Zhu, J.-Y. Wang, and J. Pei, *Toward high performance n-type thermoelectric materials by rational modification of bdpv backbones*, *J. Am. Chem. Soc.*, **2015**, *137*, 6979.
- [188] S. N. Patel, A. M. Glauddell, D. Kiefer, and M. L. Chabinyc, *Increasing the thermoelectric power factor of a semiconducting polymer by doping from the vapor phase*, *ACS Macro Lett.*, **2016**, *5*, 268.
- [189] P. Wei, J. H. Oh, G. Dong, and Z. Bao, *Use of a 1H-benzoimidazole derivative as an n-type dopant and to enable air-stable solution-processed n-channel organic thin-film transistors*, *J. Am. Chem. Soc.*, **2010**, *132*, 8852.
- [190] R. A. Schlitz, F. G. Brunetti, A. M. Glauddell, P. L. Miller, M. A. Brady, C. J. Takacs, C. J. Hawker, and M. L. Chabinyc, *Solubility-limited extrinsic n-type doping of a high electron mobility polymer for thermoelectric applications*, *Adv. Mater.*, **2014**, *26*, 2825.
- [191] J. Liu, L. Qiu, G. Portale, J. C. Hummelen, W. R. Browne, G. t. Brink, B. J. Kooi, and L. J. A. Koster, *N-type organic thermoelectrics: improved power factor by tailoring host-dopant miscibility*, *Adv. Mater.*, **2017**, *29*, 1701641.
- [192] H. Yan, Z. Chen, Y. Zheng, C. Newman, J. R. Quinn, F. Dötz, M. Kastler, and A. Facchetti, *A high-mobility electron-transporting polymer for printed transistors*, *Nature*, **2009**, *457*, 679.
- [193] S. Wang, H. Sun, U. Ail, M. Vagin, P. O. A. Persson, J. W. Andreasen, W. Thiel, M. Berggren, X. Crispin, D. Fazzi, and S. Fabiano, *Thermoelectric properties of solution-processed n-doped ladder-type conducting polymers*, *Adv. Mater.*, **2016**, *28*, 10764.
- [194] B. D. Naab, X. Gu, T. Kurosawa, J. W. F. To, A. Salleo, and Z. Bao, *Role of polymer structure on the conductivity of n-doped polymers*, *Adv. Electron. Mater.*, **2016**, *2*, 1600004.
- [195] G. Kim and K. P. Pipe, *Thermoelectric model to characterize carrier transport in organic semiconductors*, *Phys. Rev. B*, **2012**, *86*, 085208.
- [196] X.-Q. Zhu, M.-T. Zhang, A. Yu, C.-H. Wang, and J.-P. Cheng, *Hydride, hydrogen atom, proton, and electron transfer driving forces of various five-membered heterocyclic organic hydrides and their reaction intermediates in acetonitrile*, *J. Am. Chem. Soc.*, **2008**, *130*, 2501.

- [197] L. Qiu, J. Liu, R. Alessandri, X. Qiu, M. Koopmans, R. W. A. Havenith, S. J. Marrink, R. C. Chiechi, L. J. A. Koster, and J. C. Hummelen, *Enhancing doping efficiency by improving host-dopant miscibility for fullerene-based n-type thermoelectrics*, *J. Mater. Chem. A*, **2017**, *5*, 21234.
- [198] J. Liu, L. Qiu, R. Alessandri, X. Qiu, G. Portale, J. Dong, W. Talsma, G. Ye, A. A. Sengrhan, P. C. T. Souza, M. A. Loi, R. C. Chiechi, S. J. Marrink, J. C. Hummelen, and L. J. A. Koster, *Enhancing molecular n-type doping of donor-acceptor copolymers by tailoring side chains*, *Adv. Mater.*, **2018**, *30*, 1704630.
- [199] S. Fabiano, H. Yoshida, Z. Chen, A. Facchetti, and M. A. Loi, *Orientation-dependent electronic structures and charge transport mechanisms in ultrathin polymeric n-channel field-effect transistors*, *ACS Appl. Mater. Inter.*, **2013**, *5*, 4417.
- [200] A. Luzio, L. Criante, V. D'innocenzo, and M. Caironi, *Control of charge transport in a semiconducting copolymer by solvent-induced long-range order*, *Sci. Rep.*, **2013**, *3*, 3425.
- [201] A. Giovannitti, C. B. Nielsen, D.-T. Sbircea, S. Inal, M. Donahue, M. R. Niazi, D. A. Hanifi, A. Amassian, G. G. Malliaras, J. Rivnay, and I. McCulloch, *N-type organic electrochemical transistors with stability in water*, *Nat. Commun.*, **2016**, *7*, 13066.
- [202] R. Kroon, D. Kiefer, D. Stegerer, L. Yu, M. Sommer, and C. Müller, *Polar side chains enhance processability, electrical conductivity, and thermal stability of a molecularly p-doped polythiophene*, *Adv. Mater.*, **2017**, *29*, 1700930.
- [203] J. Rivnay, M. F. Toney, Y. Zheng, I. V. Kauvar, Z. Chen, V. Wagner, A. Facchetti, and A. Salleo, *Unconventional face-on texture and exceptional in-plane order of a high mobility n-type polymer*, *Adv. Mater.*, **2010**, *22*, 4359.
- [204] G. Rossi, P. F. J. Fuchs, J. Barnoud, and L. Monticelli, *A coarse-grained MARTINI model of polyethylene glycol and of polyoxyethylene alkyl ether surfactants*, *J. Phys. Chem. B*, **2012**, *116*, 14353.
- [205] K. B. Koziara, M. Stroet, A. K. Malde, and A. E. Mark, *Testing and validation of the automated topology builder (ATB) version 2.0: prediction of hydration free enthalpies*, *J. Comput. Aided Mol. Des.*, **2014**, *28*, 221.
- [206] B. A. C. Horta, P. F. J. Fuchs, W. F. van Gunsteren, and P. H. Hünenberger, *New interaction parameters for oxygen compounds in the GROMOS force field: Improved pure-liquid and solvation properties for alcohols, ethers, aldehydes, ketones, carboxylic acids, and esters*, *J. Chem. Theory Comput.*, **2011**, *7*, 1016.
- [207] P. F. Fuchs, H. S. Hansen, P. H. Hünenberger, and B. A. Horta, *A GROMOS parameter set for vicinal diether functions: properties of polyethyleneoxide and polyethyleneglycol*, *J. Chem. Theory Comput.*, **2012**, *8*, 3943.
- [208] W. Dietz and K. Heinzinger, *Structure of liquid chloroform. A comparison between computer simulation and neutron scattering results*, *Ber. Bunsenges. Phys. Chem.*, **1984**, *88*, 543.

- [209] I. G. Tironi and W. F. van Gunsteren, *A molecular dynamics simulation study of chloroform*, *Mol. Phys.*, **1994**, *83*, 381.
- [210] P. C. T. Souza and co-workers, *Martini 3.0: a general purpose force field for coarse-grain molecular dynamics*, [in preparation](http://cgmartini.nl) (open-beta version available at <http://cgmartini.nl>).
- [211] C. Hansch, A. Leo, D. Hoekman, and D. Livingstone, *Exploring QSAR: hydrophobic, electronic, and steric constants*, Vol. 48 (American Chemical Society, 1995).
- [212] E. M. Duffy and W. L. Jorgensen, *Prediction of properties from simulations: free energies of solvation in hexadecane, octanol, and water*, *J. Am. Chem. Soc.*, **2000**, *122*, 2878.
- [213] S. Natesan, Z. Wang, V. Lukacova, M. Peng, R. Subramaniam, S. Lynch, and S. Balaz, *Structural determinants of drug partitioning in n-hexadecane/water system*, *J. Chem. Inf. Model.*, **2013**, *53*, 1424.
- [214] A. Giovannitti, D.-T. Sbircea, S. Inal, C. B. Nielsen, E. Bandiello, D. A. Hanifi, M. Sessolo, G. G. Malliaras, I. McCulloch, and J. Rivnay, *Controlling the mode of operation of organic transistors through side-chain engineering*, *Proc. Natl. Acad. Sci. U.S.A.*, **2016**, *113*, 12017.
- [215] A. Giovannitti, I. P. Maria, D. Hanifi, M. J. Donahue, D. Bryant, K. J. Barth, B. E. Makdah, A. Savva, D. Moia, M. Zetek, P. R. Barnes, O. G. Reid, S. Inal, G. Rumbles, G. G. Malliaras, J. Nelson, J. Rivnay, and I. McCulloch, *The role of the side chain on the performance of n-type conjugated polymers in aqueous electrolytes*, *Chem. Mater.*, **2018**, *30*, 2945.
- [216] J. Rivnay, S. Inal, B. A. Collins, M. Sessolo, E. Stavrinidou, X. Strakosas, C. Tassone, D. M. Delongchamp, and G. G. Malliaras, *Structural control of mixed ionic and electronic transport in conducting polymers*, *Nat. Commun.*, **2016**, *7*, 11287.
- [217] B. Meng, H. Song, X. Chen, Z. Xie, J. Liu, and L. Wang, *Replacing alkyl with oligo(ethylene glycol) as side chains of conjugated polymers for close π - π stacking*, *Macromolecules*, **2015**, *48*, 4357.
- [218] F. Jahani, S. Torabi, R. C. Chiechi, L. J. A. Koster, and J. C. Hummelen, *Fullerene derivatives with increased dielectric constants*, *Chem. Commun.*, **2014**, *50*, 10645.
- [219] X. Chen, Z. Zhang, Z. Ding, J. Liu, and L. Wang, *Diketopyrrolopyrrole-based conjugated polymers bearing branched oligo(ethylene glycol) side chains for photovoltaic devices*, *Angew. Chem. Int. Ed.*, **2016**, *55*, 10376.
- [220] A. Armin, D. M. Stoltzfus, J. E. Donaghey, A. J. Clulow, R. C. R. Nagiri, P. L. Burn, I. R. Gentle, and P. Meredith, *Engineering dielectric constants in organic semiconductors*, *J. Mater. Chem. C*, **2017**, *5*, 3736.

- [221] S. Torabi, F. Jahani, I. van Severen, C. Kanimozhi, S. Patil, R. W. A. Havenith, R. C. Chiechi, L. Lutsen, D. J. M. Vanderzande, T. J. Cleij, J. C. Hummelen, and L. J. A. Koster, *Strategy for enhancing the dielectric constant of organic semiconductors without sacrificing charge carrier mobility and solubility*, *Adv. Funct. Mater.*, **2015**, *25*, 150.
- [222] J. Brebels, J. V. Manca, L. Lutsen, D. Vanderzande, and W. Maes, *High dielectric constant conjugated materials for organic photovoltaics*, *J. Mater. Chem. A*, **2017**, *5*, 24037.
- [223] X. Liu, B. Xie, C. Duan, Z. Wang, B. Fan, K. Zhang, B. Lin, F. J. M. Colberts, W. Ma, R. A. J. Janssen, F. Huang, and Y. Cao, *A high dielectric constant non-fullerene acceptor for efficient bulk-heterojunction organic solar cells*, *J. Mater. Chem. A*, **2018**, *6*, 395.
- [224] G. Han, Y. Yi, and Z. Shuai, *From molecular packing structures to electronic processes: theoretical simulations for organic solar cells*, *Adv. Energy Mater.*, **2018**, *8*, 1702743.
- [225] P. Friederich, A. Fediai, S. Kaiser, M. Konrad, N. Jung, and W. Wenzel, *Toward design of novel materials for organic electronics*, *Adv. Mater.*, **2019**, –, 1808256.
- [226] N. R. Tummala, Z. Zheng, S. G. Aziz, V. Coropceanu, and J.-L. Brédas, *Static and dynamic energetic disorders in the C₆₀, PC₆₁BM, C₇₀, and PC₇₁BM fullerenes*, *J. Phys. Chem. Lett.*, **2015**, *6*, 3657.
- [227] G. D'Avino, Y. Olivier, L. Muccioli, and D. Beljonne, *Do charges delocalize over multiple molecules in fullerene derivatives?* *J. Mater. Chem. C*, **2016**, *4*, 3747.
- [228] S. Sami, P. A. B. Haase, R. Alessandri, R. Broer, and R. W. A. Havenith, *Can the dielectric constant of fullerene derivatives be enhanced by side chain manipulation? A predictive first principles computational study*, *J. Phys. Chem. A*, **2018**, *122*, 3919.
- [229] A. Ojala, A. Petersen, A. Fuchs, R. Lovrincic, C. Poelking, J. Trollmann, J. Hwang, C. Lennartz, H. Reichelt, H. W. Hoeffken, A. Pucci, P. Erk, T. Kirchartz, and F. Wurthner, *Merocyanine/C₆₀ planar heterojunction solar cells: effect of dye orientation on exciton dissociation and solar cell performance*, *Adv. Funct. Mater.*, **2012**, *22*, 86.
- [230] B. P. Rand, D. Cheyns, K. Vasseur, N. C. Giebink, S. Mothy, Y. Yi, V. Coropceanu, D. Beljonne, J. Cornil, J.-L. Brédas, and J. Genoe, *The impact of molecular orientation on the photovoltaic properties of a phthalocyanine/fullerene heterojunction*, *Adv. Funct. Mater.*, **2012**, *22*, 2987.
- [231] W. Ma, J. R. Tumbleston, M. Wang, E. Gann, F. Huang, and H. Ade, *Domain purity, miscibility, and molecular orientation at donor/acceptor interfaces in high performance organic solar cells: paths to further improvement*, *Adv. Energy Mater.*, **2013**, *3*, 864.
- [232] J. R. Tumbleston, B. A. Collins, L. Yang, A. C. Stuart, E. Gann, W. Ma, W. You, and H. Ade, *The influence of molecular orientation on organic bulk heterojunction solar cells*, *Nat. Photonics*, **2014**, *8*, 385.

-
- [233] C. Poelking and D. Andrienko, *Design rules for organic donor–acceptor heterojunctions: pathway for charge splitting and detrapping*, *J. Am. Chem. Soc.*, **2015**, *137*, 6320.
- [234] N. A. Ran, S. Roland, J. A. Love, V. Savikhin, C. J. Takacs, Y.-T. Fu, H. Li, V. Coropceanu, X. Liu, J.-L. Brédas, G. C. Bazan, M. F. Toney, D. Neher, and T.-Q. Nguyen, *Impact of interfacial molecular orientation on radiative recombination and charge generation efficiency*, *Nat. Commun.*, **2017**, *8*, 79.
- [235] D. P. McMahon, D. L. Cheung, and A. Troisi, *Why holes and electrons separate so well in polymer/fullerene photovoltaic cells*, *J. Phys. Chem. Lett.*, **2011**, *2*, 2737.
- [236] A. Wadsworth, Z. Hamid, M. Bidwell, R. S. Ashraf, J. I. Khan, D. H. Anjum, C. Cendra, J. Yan, E. Rezasoltani, A. A. Y. Guilbert, M. Azzouzi, N. Gasparini, J. H. Bannock, D. Baran, H. Wu, J. C. de Mello, C. J. Brabec, A. Salleo, J. Nelson, F. Laquai, and I. McCulloch, *Progress in poly (3-hexylthiophene) organic solar cells and the influence of its molecular weight on device performance*, *Adv. Energy Mater.*, **2018**, *8*, 1801001.
- [237] G. J. Hedley, A. Ruseckas, and I. D. W. Samuel, *Light harvesting for organic photovoltaics*, *Chem. Rev.*, **2017**, *117*, 796.
- [238] L. Ye, W. Zhao, S. Li, S. Mukherjee, J. H. Carpenter, O. Awartani, X. Jiao, J. Hou, and H. Ade, *High-efficiency nonfullerene organic solar cells: critical factors that affect complex multi-length scale morphology and device performance*, *Adv. Energy Mater.*, **2017**, *7*, 1602000.
- [239] D. Fazzi, M. Barbatti, and W. Thiel, *Hot and cold charge-transfer mechanisms in organic photovoltaics: insights into the excited states of donor/acceptor interfaces*, *J. Phys. Chem. Lett.*, **2017**, *8*, 4727.
- [240] K. Vandewal, S. Albrecht, E. T. Hoke, K. R. Graham, J. Widmer, J. D. Douglas, M. Schubert, W. R. Mateker, J. T. Bloking, G. F. Burkhard, A. Sellinger, J. M. J. Frechet, A. Amasian, M. K. Riede, M. D. McGehee, D. Neher, and A. Salleo, *Efficient charge generation by relaxed charge-transfer states at organic interfaces*, *Nat. Mater.*, **2014**, *13*, 63.
- [241] G. Grancini, M. Maiuri, D. Fazzi, A. Petrozza, H. Egelhaaf, D. Brida, G. Cerullo, and G. Lanzani, *Hot exciton dissociation in polymer solar cells*, *Nat. Mater.*, **2013**, *12*, 29.
- [242] K. R. Graham, C. Cabanetos, J. P. Jahnke, M. N. Idso, A. El Labban, G. O. Ngongang Ndjawa, T. Heumueller, K. Vandewal, A. Salleo, B. F. Chmelka, and *et al.*, *Importance of the donor:fullerene intermolecular arrangement for high-efficiency organic photovoltaics*, *J. Am. Chem. Soc.*, **2014**, *136*, 9608.
- [243] S. Zhang, J. Gao, W. Wang, C. Zhan, S. Xiao, Z. Shi, and W. You, *Effect of replacing alkyl side chains with triethylene glycols on photovoltaic properties of easily accessible fluorene-based non-fullerene molecular acceptors: improve or deteriorate?* *ACS Appl. Mater. Inter.*, **2018**, *1*, 1276.

- [244] B. Xu, X. Yi, T.-Y. Huang, Z. Zheng, J. Zhang, A. Salehi, V. Coropceanu, C. H. Y. Ho, S. R. Marder, M. F. Toney, J.-L. Brédas, F. So, and J. R. Reynolds, *Donor conjugated polymers with polar side chain groups: the role of dielectric constant and energetic disorder on photovoltaic performance*, *Adv. Funct. Mater.*, **2018**, *28*, 1803418.
- [245] S. Torabi, *Organic Semiconductors for Next Generation Organic Photovoltaics*, Zernike Institute PhD Thesis Series No. 07 (University of Groningen, 2018).
- [246] F. Grunewald, G. Rossi, A. H. de Vries, S. J. Marrink, and L. Monticelli, *Transferable martini model of poly(ethylene oxide)*, *J. Phys. Chem. B*, **2018**, *122*, 7436.
- [247] O. Andreussi, I. G. Prandi, M. Campetella, G. Prampolini, and B. Mennucci, *Classical force fields tailored for QM applications: is it really a feasible strategy?* *J. Chem. Theory Comput.*, **2017**, *13*, 4636.
- [248] R. Alessandri, *Polymerize Atomistic P3HT*, https://figshare.com/articles/Polymerize_Atomic_P3HT/5853060, **2018**,.
- [249] C. F. Guerra, J. Snijders, G. t. te Velde, and E. Baerends, *Towards an order-N DFT method*, *Theor. Chem. Acc.*, **1998**, *99*, 391.
- [250] G. te Velde, F. M. Bickelhaupt, E. J. Baerends, C. Fonseca Guerra, S. J. A. van Gisbergen, J. G. Snijders, and T. Ziegler, *Chemistry with ADF*, *J. Comput. Chem.*, **2001**, *22*, 931.
- [251] A. F. Oliveira, P. Philipsen, and T. Heine, *DFTB parameters for the periodic table, part 2: energies and energy gradients from hydrogen to calcium*, *J. Chem. Theory Comput.*, **2015**, *11*, 5209.
- [252] E. A. Silinsh, *Organic molecular crystals: their electronic states*, Vol. 16 (Springer, 2012).
- [253] A. V. Marenich, S. V. Jerome, C. J. Cramer, and D. G. Truhlar, *Charge Model 5: an extension of Hirshfeld population analysis for the accurate description of molecular interactions in gaseous and condensed phases*, *J. Chem. Theory Comput.*, **2012**, *8*, 527.
- [254] F. L. Hirshfeld, *Bonded-atom fragments for describing molecular charge densities*, *Theor. Chim. Acta*, **1977**, *44*, 129.
- [255] M. J. Frisch, G. W. Trucks, H. B. Schlegel, G. E. Scuseria, M. A. Robb, J. R. Cheeseman, G. Scalmani, V. Barone, G. A. Petersson, H. Nakatsuji, X. Li, M. Caricato, A. V. Marenich, J. Bloino, B. G. Janesko, *et al.*, *Gaussian 16, Revision A.03*, **2016**, Gaussian Inc. Wallingford CT.
- [256] C. Poelking, K. Daoulas, A. Troisi, and D. Andrienko, *Morphology and charge transport in P3HT: a theorist's perspective*, in *P3HT revisited – From molecular scale to solar cell devices*, edited by S. Ludwigs (Springer Berlin Heidelberg, Berlin, Heidelberg, 2014) pp. 139–180.

-
- [257] P. Bounds and R. Munn, *Polarization energy of a localized charge in a molecular crystal. II. Charge-quadrupole energy*, *Chem. Phys.*, **1981**, *59*, 41.
- [258] J. Sin, E. Tsiper, and Z. Soos, *Atomic multipolar contributions to electronic polarization in organic molecular crystals*, *Europhys. Lett.*, **2002**, *60*, 743.
- [259] E. Brini, E. A. Algaer, P. Ganguly, C. Li, F. Rodríguez-Roperó, and N. F. A. van der Vegt, *Systematic coarse-graining methods for soft matter simulations – a review*, *Soft Matter*, **2013**, *9*, 2108.
- [260] A. J. Pak and G. A. Voth, *Advances in coarse-grained modeling of macromolecular complexes*, *Curr. Opin. Struct. Biol.*, **2018**, *52*, 119.
- [261] B. M. H. Bruininks, P. C. T. Souza, and S. J. Marrink, *A practical view of the martini force field*, in *Biomolecular Simulations: Methods and Protocols*, edited by M. Bonomi and C. Camilloni (Springer New York, New York, NY, 2019) pp. 105–127.
- [262] S. J. Marrink, V. Corradi, P. C. Souza, H. I. Ingólfsson, D. P. Tieleman, and M. S. Sansom, *Computational modeling of realistic cell membranes*, *Chem. Rev.*, **2019**, *119*, 6184.
- [263] G. Enkavi, M. Javanainen, W. Kulig, T. Róg, and I. Vattulainen, *Multiscale simulations of biological membranes: The challenge to understand biological phenomena in a living substance*, *Chem. Rev.*, **2019**, *119*, 5607.
- [264] D. Bochicchio and G. M. Pavan, *From cooperative self-assembly to water-soluble supramolecular polymers using coarse-grained simulations*, *ACS Nano*, **2017**, *11*, 1000.
- [265] P. W. J. M. Frederix, I. Patmanidis, and S. J. Marrink, *Molecular simulations of self-assembling bio-inspired supramolecular systems and their connection to experiments*, *Chem. Soc. Rev.*, **2018**, *47*, 3470.
- [266] M. Modarresi, J. F. Franco-Gonzalez, and I. Zozoulenko, *Morphology and ion diffusion in PEDOT:Tos. A coarse grained molecular dynamics simulation*, *Phys. Chem. Chem. Phys.*, **2018**, *20*, 17188.
- [267] A. Y. Mehandzhyski and I. Zozoulenko, *Computational microscopy of PEDOT:PSS/cellulose composite paper*, *ACS Appl. Energy Mater.*, **2019**, *2*, 3568.
- [268] F. Jiménez-Ángeles, H.-K. Kwon, K. Sadman, T. Wu, K. R. Shull, and M. Olvera de la Cruz, *Self-assembly of charge-containing copolymers at the liquid-liquid interface*, *ACS Cent. Sci.*, **2019**, *5*, 688.
- [269] N. T. Southall, K. A. Dill, and A. D. J. Haymet, *A view of the hydrophobic effect*, *J. Phys. Chem. B*, **2002**, *106*, 521.
- [270] R. Mannhold, G. I. Poda, C. Ostermann, and I. V. Tetko, *Calculation of molecular lipophilicity: state-of-the-art and comparison of logP methods on more than 96,000 compounds*, *J. Pharm. Sci.*, **2009**, *98*, 861.

- [271] W. M. Haynes, *CRC handbook of chemistry and physics* (CRC press, 2014).
- [272] D. H. de Jong, G. Singh, W. D. Bennett, C. Arnarez, T. A. Wassenaar, L. V. Schafer, X. Periole, D. P. Tieleman, and S. J. Marrink, *Improved parameters for the Martini coarse-grained protein force field*, *J. Chem. Theory Comput.*, **2013**, *9*, 687.
- [273] H. J. Risselada and S. J. Marrink, *The molecular face of lipid rafts in model membranes*, *Proc. Natl. Acad. Sci. U.S.A.*, **2008**, *105*, 17367.
- [274] F. X. Zhou, M. J. Cocco, W. P. Russ, A. T. Brunger, and D. M. Engelman, *Interhelical hydrogen bonding drives strong interactions in membrane proteins*, *Nat. Struct. Mol. Biol.*, **2000**, *7*, 154.
- [275] F. X. Zhou, H. J. Merianos, A. T. Brunger, and D. M. Engelman, *Polar residues drive association of polyleucine transmembrane helices*, *Proc. Natl. Acad. Sci. U.S.A.*, **2001**, *98*, 2250.
- [276] B. Grau, M. Javanainen, M. J. García-Murria, W. Kulig, I. Vattulainen, I. Mingarro, and L. Martínez-Gil, *The role of hydrophobic matching on transmembrane helix packing in cells*, *Cell Stress*, **2017**, *1*, 90.
- [277] X. Periole, M. Cavalli, S.-J. Marrink, and M. A. Ceruso, *Combining an elastic network with a coarse-grained molecular force field: Structure, dynamics, and intermolecular recognition*, *J. Chem. Theory Comput.*, **2009**, *5*, 2531.
- [278] M. N. Melo, H. I. Ingólfsson, and S. J. Marrink, *Parameters for Martini sterols and hopanoids based on a virtual-site description*, *J. Chem. Phys.*, **2015**, *143*, 243152.
- [279] T. Bereau and K. Kremer, *Automated parametrization of the coarse-grained Martini force field for small organic molecules*, *J. Chem. Theory Comput.*, **2015**, *11*, 2783.
- [280] S. Genheden, *Solvation free energies and partition coefficients with the coarse-grained and hybrid all-atom/coarse-grained MARTINI models*, *J. Comput. Aided Mol. Des.*, **2017**, *31*, 867.
- [281] A. C. Stark, C. T. Andrews, and A. H. Elcock, *Toward optimized potential functions for protein-protein interactions in aqueous solutions: osmotic second virial coefficient calculations using the MARTINI coarse-grained force field*, *J. Chem. Theory Comput.*, **2013**, *9*, 4176.
- [282] M. Javanainen, H. Martinez-Seara, and I. Vattulainen, *Excessive aggregation of membrane proteins in the martini model*, *PLoS One*, **2017**, *12*, 1.
- [283] X. Periole, T. Zeppelin, and B. Schiött, *Dimer interface of the human serotonin transporter and effect of the membrane composition*, *Sci. Rep.*, **2018**, *8*, 5080.
- [284] P. S. Schmalhorst, F. Deluweit, R. Scherrers, C.-P. Heisenberg, and M. Sikora, *Overcoming the limitations of the MARTINI force field in simulations of polysaccharides*, *J. Chem. Theory Comput.*, **2017**, *13*, 5039.

-
- [285] D. Petrov and B. Zagrovic, *Are current atomistic force fields accurate enough to study proteins in crowded environments?* *PLOS Comput. Biol.*, **2014**, *10*, 1.
- [286] A. B. Poma, M. Cieplak, and P. E. Theodorakis, *Combining the MARTINI and structure-based coarse-grained approaches for the molecular dynamics studies of conformational transitions in proteins*, *J. Chem. Theory Comput.*, **2017**, *13*, 1366.
- [287] S. Thallmair, P. A. Vainikka, and S. J. Marrink, *Lipid fingerprints and cofactor dynamics of light-harvesting complex ii in different membranes*, *Biophys. J.*, **2019**, *116*, 1446.
- [288] S. Nosé, *A molecular dynamics method for simulations in the canonical ensemble*, *Mol. Phys.*, **1984**, *52*, 255.
- [289] W. G. Hoover, *Canonical dynamics: equilibrium phase-space distributions*, *Phys. Rev. A*, **1985**, *31*, 1695.
- [290] G. Torrie and J. Valleau, *Nonphysical sampling distributions in monte carlo free-energy estimation: Umbrella sampling*, *J. Comput. Phys.*, **1977**, *23*, 187.
- [291] H. J. C. Berendsen, J. P. M. Postma, W. F. van Gunsteren, and J. Hermans, *Interaction models for water in relation to protein hydration*, in *Intermolecular Forces*, edited by B. Pullman (Springer Netherlands, Dordrecht, 1981) pp. 331–342.
- [292] W. L. Jorgensen, J. Chandrasekhar, J. D. Madura, R. W. Impey, and M. L. Klein, *Comparison of simple potential functions for simulating liquid water*, *J. Chem. Phys.*, **1983**, *79*, 926.
- [293] T. C. Beutler, A. E. Mark, R. C. van Schaik, P. R. Gerber, and W. F. van Gunsteren, *Avoiding singularities and numerical instabilities in free energy calculations based on molecular simulations*, *Chem. Phys. Lett.*, **1994**, *222*, 529.
- [294] T. A. Wassenaar, H. I. Ingólfsson, R. A. Böckmann, D. P. Tieleman, and S. J. Marrink, *Computational lipidomics with insane: a versatile tool for generating custom membranes for molecular simulations*, *J. Chem. Theory Comput.*, **2015**, *11*, 2144.
- [295] C. Peter and K. Kremer, *Multiscale simulation of soft matter systems – from the atomistic to the coarse-grained level and back*, *Soft Matter*, **2009**, *5*, 4357.
- [296] M. G. Saunders and G. A. Voth, *Coarse-graining methods for computational biology*, *Ann. Rev. Biophys.*, **2013**, *42*, 73.
- [297] H. I. Ingólfsson, C. Arnarez, X. Periole, and S. J. Marrink, *Computational ‘microscopy’ of cellular membranes*, *J. Cell Sci.*, **2016**, *129*, 257.
- [298] P. W. Frederix, G. G. Scott, Y. M. Abul-Haija, D. Kalafatovic, C. G. Pappas, N. Javid, N. T. Hunt, R. V. Ulijn, and T. Tuttle, *Exploring the sequence space for (tri-) peptide self-assembly to design and discover new hydrogels*, *Nat. Chem.*, **2015**, *7*, 30.
- [299] P. E. Rouse Jr, *A theory of the linear viscoelastic properties of dilute solutions of coiling polymers*, *J. Chem. Phys.*, **1953**, *21*, 1272.

- [300] M. Böckmann, T. Schemme, D. H. de Jong, C. Denz, A. Heuer, and N. L. Doltsinis, *Structure of P3HT crystals, thin films, and solutions by UV/Vis spectral analysis*, *Phys. Chem. Chem. Phys.*, **2015**, *17*, 28616.
- [301] J. A. Graham, J. W. Essex, and S. Khalid, *PyCGTOOL: automated generation of coarse-grained molecular dynamics models from atomistic trajectories*, *J. Chem. Inf. Model.*, **2017**, *57*, 650.
- [302] P. C. Kroon and co-workers, *Cartographer: an automated topology builder for Martini*, in preparation.
- [303] B. Hess, H. Bekker, H. J. Berendsen, and J. G. E. M. Fraaije, *LINCS: a linear constraint solver for molecular simulations*, *J. Comput. Chem.*, **1997**, *18*, 1463.
- [304] K. A. Feenstra, B. Hess, and H. J. C. Berendsen, *Improving efficiency of large time-scale molecular dynamics simulations of hydrogen-rich systems*, *J. Comput. Chem.*, **1999**, *20*, 786.
- [305] C. Caleman, P. J. van Maaren, M. Hong, J. S. Hub, L. T. Costa, and D. van der Spoel, *Force field benchmark of organic liquids: density, enthalpy of vaporization, heat capacities, surface tension, isothermal compressibility, volumetric expansion coefficient, and dielectric constant*, *J. Chem. Theory Comput.*, **2012**, *8*, 61.
- [306] C. Caleman, D. van der Spoel, and P. J. van Maaren, *GROMACS molecule & liquid database*, *Bioinformatics*, **2012**, *28*, 752.
- [307] N. Schmid, A. P. Eichenberger, A. Choutko, S. Riniker, M. Winger, A. E. Mark, and W. F. van Gunsteren, *Definition and testing of the GROMOS force-field versions 54A7 and 54B7*, *Eur. Biophys. J.*, **2011**, *40*, 843.
- [308] M. Stroet, B. Caron, K. M. Visscher, D. P. Geerke, A. K. Malde, and A. E. Mark, *Automated topology builder version 3.0: prediction of solvation free enthalpies in water and hexane*, *J. Chem. Theory Comput.*, **2018**, *14*, 5834.
- [309] J. Domański, O. Beckstein, and B. I. Iorga, *Ligandbook: an online repository for small and drug-like molecule force field parameters*, *Bioinformatics*, **2017**, *33*, 1747.
- [310] W. Yu, X. He, K. Vanommeslaeghe, and A. D. MacKerell Jr., *Extension of the CHARMM general force field to sulfonyl-containing compounds and its utility in biomolecular simulations*, *J. Comput. Chem.*, **2012**, *33*, 2451.
- [311] L. Bernazzani, S. Cabani, G. Conti, and V. Mollica, *Thermodynamic study of the partitioning of organic compounds between water and octan-1-ol. Effects of water as cosolvent in the organic phase*, *J. Chem. Soc., Faraday Trans.*, **1995**, *91*, 649.
- [312] J. Kastner, *Umbrella sampling*, *WIREs Comput. Mol. Sci.*, **2011**, *1*, 932.
- [313] A. Barducci, G. Bussi, and M. Parrinello, *Well-tempered metadynamics: a smoothly converging and tunable free-energy method*, *Phys. Rev. Lett.*, **2008**, *100*, 020603.

-
- [314] A. Barducci, M. Bonomi, and M. Parrinello, *Metadynamics*, [WIREs Comput. Mol. Sci.](#), **2011**, *1*, 826.
- [315] A. Laio and M. Parrinello, *Escaping free-energy minima*, [Proc. Natl. Acad. Sci. U.S.A.](#), **2002**, *99*, 12562.
- [316] D. Branduardi, G. Bussi, and M. Parrinello, *Metadynamics with adaptive gaussians*, [J. Chem. Theory Comput.](#), **2012**, *8*, 2247.
- [317] G. A. Tribello, M. Bonomi, D. Branduardi, C. Camilloni, and G. Bussi, *PLUMED 2: new feathers for an old bird*, [Comput. Phys. Commun.](#), **2014**, *185*, 604.
- [318] J. Sangster, *Octanol-water partition coefficients of simple organic compounds*, [J. Phys. Chem. Ref. Data](#), **1989**, *18*, 1111.
- [319] M. H. Abraham, J. A. Platts, A. Hersey, A. J. Leo, and R. W. Taft, *Correlation and estimation of gas-chloroform and water-chloroform partition coefficients by a linear free energy relationship method*, [J. Pharm. Sci.](#), **1999**, *88*, 670.
- [320] M. G. Martin, *Comparison of the AMBER, CHARMM, COMPASS, GROMOS, OPLS, TraPPE and UFF force fields for prediction of vapor-liquid coexistence curves and liquid densities*, [Fluid Ph. Equilibria](#), **2006**, *248*, 50.
- [321] A. J. Sweere and J. G. E. M. Fraaije, *Accuracy test of the OPLS-AA force field for calculating free energies of mixing and comparison with PAC-MAC*, [J. Chem. Theory Comput.](#), **2017**, *13*, 1911.
- [322] A. Y. Ben-Naim, *Solvation thermodynamics* (Springer, 2013).
- [323] G. Scatchard, S. E. Wood, and J. M. Mochel, *Vapor-liquid equilibrium. III. Benzene-cyclohexane mixtures*. [J. Phys. Chem.](#), **1939**, *43*, 119.
- [324] A. Campbell, E. M. Kartzmark, and R. Chatterjee, *Excess volumes, vapor pressures, and related thermodynamic properties of the system acetone-chloroform-benzene, and its component binary systems*, [Can. J. Chem.](#), **1966**, *44*, 1183.
- [325] S. Zhang, L. Ye, H. Zhang, and J. Hou, *Green-solvent-processable organic solar cells*, [Mater. Today](#), **2016**, *19*, 533.
- [326] J. Hou, O. Inganäs, R. H. Friend, and F. Gao, *Organic solar cells based on non-fullerene acceptors*, [Nat. Mater.](#), **2018**, *17*, 119.
- [327] H. Sun, T. Liu, J. Yu, T.-K. Lau, G. Zhang, Y. Zhang, M. Su, Y. Tang, R. Ma, B. Liu, J. Liang, K. Feng, X. Lu, X. Guo, F. Gao, and H. Yan, *A monothiophene unit incorporating both fluoro and ester substitution enabling high-performance donor polymers for non-fullerene solar cells with 16.4% efficiency*, [Energy Environ. Sci.](#), **2019**, –, [10.1039/C9EE01890E](https://doi.org/10.1039/C9EE01890E).
- [328] M. Modarresi, J. F. Franco-Gonzalez, and I. Zozoulenko, *Computational microscopy study of the granular structure and pH dependence of PEDOT:PSS*, [Phys. Chem. Chem. Phys.](#), **2019**, *21*, 6699.

- [329] M. Campoy-Quiles, T. Ferenczi, T. Agostinelli, P. G. Etchegoin, Y. Kim, T. D. Anthopoulos, P. N. Stavrinou, D. D. C. Bradley, and J. Nelson, *Morphology evolution via self-organization and lateral and vertical diffusion in polymer:fullerene solar cell blends*, *Nat. Mater.*, **2008**, *7*, 158.
- [330] S. G. Bucella, A. Luzio, E. Gann, L. Thomsen, C. R. McNeill, G. Pace, A. Perinot, Z. Chen, A. Facchetti, and M. Caironi, *Macroscopic and high-throughput printing of aligned nanostructured polymer semiconductors for MHz large-area electronics*, *Nat. Commun.*, **2015**, *6*, 8394.
- [331] V. Negi, A. Lyulin, and P. Bobbert, *Solvent-dependent structure formation in drying P3HT:PCBM films studied by molecular dynamics simulations*, *Macromol. Theory Simul.*, **2016**, *25*, 550.
- [332] C. Groves, *Simulating charge transport in organic semiconductors and devices: a review*, *Rep. Prog. Phys.*, **2017**, *80*, 026502.
- [333] X.-K. Chen, M. K. Ravva, H. Li, S. M. Ryno, and J.-L. Brédas, *Effect of molecular packing and charge delocalization on the nonradiative recombination of charge-transfer states in organic solar cells*, *Adv. Energy Mater.*, **2016**, *6*, 1601325.
- [334] <https://github.com/marrink-lab/vermouth-martinize>.

Summary

The field of organic electronics promises a host of thin, lightweight, flexible, and environmentally friendly electronic devices—such as solar cells, biosensors, and transistors. Such devices are made possible by the use of *organic materials*, materials constituted by organic molecules—that is, carbon-based molecules—which possibly possess interesting electronic properties. To fulfill this promise, scientists need to resolve one fundamental complication which finds its roots in the virtually infinite possibilities offered by organic molecules: master the relations between the molecular structure of the single molecules, their aggregate morphology—that is, how the molecules organize themselves to constitute the organic material—and the performance of the resulting electronic device. The formidable task of mastering these relations requires help from computational modeling. Once mastered and available at the fingertips of scientists via computational protocols, the experimental efforts currently necessary would be drastically reduced, and required only for a few lead compounds which passed successfully all the computational design steps. This would drastically accelerate the development of organic electronic devices, bringing the promise of organic electronics much closer to reality.

In this context, the aim of this thesis is to demonstrate how information on the molecular organization of organic materials can be obtained by a *multiscale modeling* approach. The term “multiscale” designates the combined use of various modeling techniques with the aim of covering a large range of length and time scales, from the molecular-scale towards the device-scale. To this end, the modeling techniques used in this thesis range from coarse-grain molecular dynamics simulations, used to address processes which occur on the larger length and time scales, to density functional theory calculations, used to address processes which occur on much shorter length and time scales. Coarse-grain models treat the system in a more approximate way by describing groups of atoms as effective interaction sites which interact following classical mechanics; models based on density functional theory treat instead even electrons explicitly, and thus must follow the more complex laws of quantum mechanics. The use of a wide range of computational techniques allows to connect features of the single molecules to their collective structural organization, and to understand how this in turn affects the electronic properties of the organic material, and thus of the resulting electronic device.

The quest for relations between the molecular structure of the single molecules, their aggregate morphology, and the performance of the resulting electronic device starts from improving the modeling of the *morphology*. None of the existing modeling techniques offered the combination of being able to 1) reach relevant length scales, 2) retain chemical specificity, 3) mimic experimental fabrication conditions such as solution-processing, and 4) be used in high-throughput studies. [Chapter 2](#) presents a method which fulfills these requirements. The method has two key ingredients: *i*) the use of molecular dynamics simulations based on the Martini coarse-grain model, which can reach relevant length scales while retaining a sizable degree of chemical detail; the model is moreover suitable for high-throughput studies due to its modularity; *ii*) the use of computational protocols which take into account fabrication conditions of an organic thin film such as solution-processing. The method is not only applicable to organic materials for solar cells, as showcased in [chapter 2](#), but also for any other organic electronic device, as shown in [chapter 3](#) for organic thermoelectric blends. In both cases, the obtained simulated morphologies are in agreement with experimental findings, but also provide a molecular view on the structure of the materials and their evolution during fabrication processes.

The second paramount benefit of the method developed in [chapter 2](#) is the possibility of easily converting, via backmapping techniques, the coarse-grained morphology to full atomistic resolution. This paves the way for advanced electronic structure calculations, for which atomistic details is required, in realistic morphologies of organic materials. This is shown in [chapter 4](#), where the detailed structural conformations at the donor-acceptor interfaces of organic solar cells are resolved and studied as a function of processing conditions and molecular features. Moreover, the atomistic resolutions allows for the computation of energy levels relevant for the functioning of the solar cells. The findings of this chapter show that the use of organic molecules functionalized with polar side chains introduces energetic disorder, with potentially detrimental effects on the voltage of the resulting solar cells.

So far, the state-of-the-art Martini coarse-grain model has proven reliable enough to probe the larger length and time scales. Some limitations of this model are however described in detail in [chapter 5](#). The key finding of the chapter is the importance of the density of particles present in the simulation. This critical parameter of the system can be greatly affected by bond lengths in the models; an inattentive use of bond length parameters can thus cause deviations from the parametrized behavior of the force field. In the view of these findings, the chapter discusses implications for the use of the current Martini force field, and suggests directions for reparametrization, effectively forming the basis of the next generation of the Martini force field.

The realization of the limitations concerning the Martini model described in chapter 5 initiated the development of a new major version of the force field, dubbed *Martini 3.0*. The key characteristic of the new Martini model is a much-improved balance between the interactions of the particles of different sizes which can be used to describe molecules. In [chapter 6](#), the new parametrization, along with features and performances of the new Martini 3.0 models, is described focusing on small cyclic molecules, molecules which are, for example, particularly relevant for organic materials. Cyclic molecules constituted the main reference for the parameters of the newly recalibrated smaller particle sizes of the force field. This work is expected to boost and open new avenues in the use of the Martini model for systems containing such molecular fragments, such as organic materials relevant for electronics.

This thesis enables multiple developments and extensions, including the possibility of simulating an ever larger number of organic materials, while systematically connecting the obtained morphologies to the electronic properties which are fundamental to the functioning of the resulting electronic devices. Taken together, the findings of this thesis contribute to the route towards an age where the design of organic materials is based on computational models and simulations.

Samenvatting

Het vakgebied van de organische elektronica belooft de ontwikkeling van een grote verscheidenheid aan dunne, lichtgewicht, flexibele en milieuvriendelijke elektronische apparaten – zoals zonnecellen, biosensoren en transistoren – dankzij het gebruik van *organische materialen*. Zulke materialen bestaan uit organische moleculen – moleculen gebaseerd op koolstof – die mogelijk interessante elektronische eigenschappen bezitten. Om deze ontwikkeling mogelijk te maken moeten wetenschappers echter eerst een fundamenteel probleem oplossen waarvan de oorzaak ligt in het vrijwel oneindig aantal mogelijkheden die organische moleculen bieden: het begrijpen van de relatie tussen de moleculaire structuur van het individuele molecuul, zijn geaggregeerde morfologie – dat is hoe de moleculen zich organiseren tot het organische materiaal – en de prestaties van het van uit materiaal gefabriceerde apparaat. Computermodellen zijn nodig om deze enorme uitdaging aan te gaan. Wanneer men de relatie tussen molecuul, aggregaat en apparaat begrijpt en deze in de vorm van computationele protocollen beschikbaar zijn voor wetenschappers, zal de tijd die op dit moment nodig is voor experimenteel onderzoek drastisch omlaag gaan, en zullen experimentele testen alleen nodig zijn voor die materialen die succesvol alle computationele ontwerpstappen hebben doorlopen. Dit zou een drastische versnelling betekenen voor de ontwikkeling van organische elektronica, en een flinke stap in het realiseren van de belofte van organische elektronica.

In deze context is het doel van dit proefschrift te laten zien hoe informatie van de moleculaire organisatie van organische materialen kan worden verkregen via *multischaal modelleren*. De term “multischaal” duidt op het gecombineerde gebruik van verscheidene modelleertechnieken met het doel om een breed scala aan lengte- en tijdschalen te beschrijven, van de molecuulschaal tot aan de apparaatschaal. Voor dit doel worden er in dit proefschrift gebruik gemaakt van modelleertechnieken variërend van grofkorrelige moleculaire dynamica simulaties, die gebruikt worden om processen die op de grotere ruimte- en tijdschalen plaats vinden te omschrijven, tot aan dichtheidsfunctionaaltheorie, een modelleertechniek die processen beschrijft die op veel kortere tijd- en lengteschalen plaatsvinden. Grofkorrelige modellen schetsen moleculaire systemen meer bij benadering waarbij het groeperen van atomen beschrijft als deeltjes die op elkaar inwerken volgens de wetten van de klassieke mechanica; dichtheidsfunctionaaltheorie beschrijft daarentegen zelfs elektronen expliciet en vereist daarom het gebruik van de complexere wetten van de kwantummechanica. Het gebruik van een groot scala aan computationele

technieken maakt het mogelijk om kenmerken van het individuele molecuul te verbinden met de structurele organisatie van het collectief en hoe dit op zijn beurt de elektronische eigenschappen van het organische materiaal en het resulterende apparaat beïnvloedt.

Het onderzoek naar de relatie tussen de structuur van het individuele molecuul, de morfologie van het aggregaat en de prestaties van het resulterende apparaat begint bij het verbeteren van het modelleren van de *morfologie*. Geen van de bestaande modelleertech- niken kon zowel 1) relevante lengteschalen behalen, 2) chemische specificiteit behouden, 3) experimentele fabricatie-omstandigheden nabootsen zoals oplossingsverwerking en 4) en gebruikt worden in zogeheten “high throughput” studies. [Hoofdstuk 2](#) presenteert een methode die aan al deze voorwaarden voldoet. Deze methode heeft twee essentiële componenten: *i*) het gebruik van moleculaire dynamica simulaties gebaseerd op het grof- korrelige Martini model, dat relevante lengteschalen behaalt terwijl het een redelijk deel van de chemische details behoudt; het model is daarbij dankzij zijn modulariteit geschikt voor “high-throughput” studies; *ii*) het gebruik van computerprotocollen die rekening houden met fabricagecondities van een organische film zoals oplossingsverwerking. De methode is niet alleen van toepassing op organische materialen voor zonnecellen, zoals uiteengezet in hoofdstuk 2, maar ook voor elk ander organisch elektronisch apparaat, zoals in [hoofdstuk 3](#) gedemonstreerd wordt voor organische thermo-elektrische mengsels. In beide gevallen zijn de verkregen gesimuleerde morfologieën niet alleen in overeenstem- ming met experimentele bevindingen, maar bieden ook een beeld van de moleculaire structuur van de materialen en hun evolutie tijdens de fabricageprocessen.

Het tweede belangrijke voordeel van de in hoofdstuk 2 ontwikkelde methode is de mo- gelijkheid dat de grofkorrelige morfologie eenvoudig naar volledige atomistische resolutie te converteren is door gebruik te maken van de kennis over de correspondentie tussen de posities van de grofstoffelijke deeltjes en de atomen waaruit ze zijn opgebouwd. Dit maakt de weg vrij voor het doen van geavanceerde berekeningen van de elektronische structuur in realistische morfologieën van organische materialen, waarvoor volledig atomistisch de- tail nodig is. Dit wordt gedemonstreerd in [hoofdstuk 4](#), waar de gedetailleerde structurele conformaties op het donor-acceptor raakvlak in zonnecellen worden ontrafeld en bestu- deerd als functie van de fabricagecondities en moleculaire eigenschappen. Bovendien maakt de atomistische resolutie het mogelijk om energieniveaus te berekenen die relevant zijn voor het functioneren van de zonnecellen. De bevindingen van dit hoofdstuk laten zien dat het gebruik van organische moleculen die gefunctionaliseerd zijn met polaire zijketens onregelmatigheden in de energieniveaus veroorzaakt, met mogelijk schadelijke effecten op het voltage van de resulterende zonnecellen.

Het geavanceerde grofkorrelige Martini model bleek tot nu toe betrouwbaar genoeg voor het modelleren van de grotere lengte- en tijdschalen. Enkele beperkingen van dit model worden echter in [hoofdstuk 5](#) in detail beschreven. De belangrijkste bevinding van het hoofdstuk is het belang van de dichtheid van de deeltjes in de simulatie. Deze kritieke parameter kan sterk worden beïnvloed door de bindingslengtes in de modellen; een onoplettend gebruik van verkorte bindingslengtes kan resulteren in afwijkingen van het in het krachtenveld geparameteriseerde gedrag. Naar aanleiding van deze bevindingen worden in het hoofdstuk de implicaties voor het huidige Martini krachtenveld bediscussieerd en worden er aanbevelingen gedaan voor her-parameterisatie, daarbij de basis vormend voor de volgende generatie van het Martini krachtenveld.

De bewustwording over de in hoofdstuk 5 beschreven beperkingen van het Martini model initieerde de ontwikkeling van een nieuwe, belangrijke, versie van het krachtenveld, *Martini 3.0*. Een belangrijke eigenschap van het nieuwe Martini model is een sterk verbeterde balans van de wisselwerking tussen deeltjes van verschillende grootte die gebruikt kunnen worden om moleculen te beschrijven. In [hoofdstuk 6](#) wordt de nieuwe parameterisatie beschreven samen met de kenmerken en de prestaties van de nieuwe Martini 3.0 modellen. Hierbij wordt vooral aandacht gegeven aan kleine cyclische moleculen die in het bijzonder belangrijk zijn voor organische materialen. De parameters van de nieuwe geherkalibreerde kleinere deeltjes in het krachtenveld worden voornamelijk gebruikt in cyclische moleculen. Verwacht wordt dat dit werk een boost geeft aan en nieuwe wegen zal openen voor het gebruik van het Martini model voor systemen met dergelijke moleculaire fragmenten, zoals organische materialen relevant voor elektronica.

Dit proefschrift maakt verscheidene ontwikkelingen en uitbreidingen mogelijk, waaronder de mogelijkheid tot het simuleren van een almaar groeiend aantal organische materialen, waarbij de verkregen morfologieën verbonden worden met de elektronische eigenschappen die fundamenteel zijn voor het functioneren van de resulterende elektronica. Bij elkaar genomen dragen de bevindingen in dit proefschrift bij aan de weg naar een tijdperk waarin het ontwerp van organische materialen is gebaseerd op computermodellen en simulaties.

Riepilogo

Il campo dell'elettronica organica promette lo sviluppo di un'ampia varietà di dispositivi elettronici – come per esempio celle solari, biosensori, o transistor – che in futuro saranno sottili, leggeri, flessibili, ecologici, e stampabili con tecniche come la stampa a getto d'inchiostro. Tali dispositivi sono ottenibili grazie all'uso di *materiali organici*, ovvero materiali composti da molecole organiche – vale a dire, molecole a base di carbonio – le quali possono godere di interessanti proprietà elettroniche. Per tenere fede a questa promessa, la scienza deve andare alla radice di un problema complesso che trova origine nelle infinite configurazioni adottabili dalle molecole organiche: scoprire le relazioni fondamentali che connettono la struttura delle singole molecole, l'organizzazione di un insieme di tali molecole, che costituiranno poi il materiale principale del dispositivo elettronico, e le caratteristiche del dispositivo stesso. Questa impresa necessita del supporto della modellazione computazionale. Una volta che queste relazioni fondamentali saranno modellate in software alla portata di scienziati e ingegneri, gli sforzi sperimentali attualmente richiesti saranno ridotti drasticamente ed applicati solo alle molecole organiche che supereranno con successo tutte le fasi di design computazionale. Ciò accelererebbe in maniera significativa lo sviluppo di dispositivi elettronici organici, spingendone l'introduzione nella realtà quotidiana.

L'obiettivo di questa tesi è quello di dimostrare l'efficacia di uno specifico approccio di *modellazione multiscala* per l'ottenimento di informazioni a livello molecolare sull'organizzazione di materiali organici. Il termine “multiscala” indica l'uso combinato di varie tecniche di modellazione computazionale al fine di coprire un ampio raggio di scale temporali e metriche, da quelle del dispositivo elettronico, a quelle della singola molecola. A tal fine, le tecniche utilizzate in questa tesi spaziano da simulazioni di dinamica molecolare di livello “coarse-grain”, utilizzate per le scale temporali e metriche più ampie, fino a tecniche basate sulla teoria del funzionale della densità elettronica, utilizzate per le scale più ridotte. Modelli di tipo coarse-grain descrivono il sistema in modo più approssimato, inglobando gruppi di atomi in particelle (pseudo-atomi) che interagiscono seguendo leggi della meccanica classica, mentre modelli basati sulla teoria del funzionale della densità elettronica, trattando in modo esplicito particelle subatomiche come gli elettroni, devono essere fedeli alle complesse leggi della meccanica quantistica. L'impiego di diverse tecniche computazionali permette la connessione tra le caratteristiche delle singole

molecole e la loro organizzazione collettiva, associando di conseguenza le caratteristiche collettive alle proprietà elettroniche del materiale organico, e quindi del dispositivo finale.

La ricerca di relazioni fondamentali che connettano la struttura della singola molecola alle caratteristiche del risultante dispositivo elettronico, inizia con il miglioramento delle tecniche di simulazione della *morfologia* dei materiali organici, vale a dire, l'organizzazione collettiva delle molecole che vanno a costituire il materiale. Nessuna delle tecniche di modellazione esistenti offre simultaneamente la possibilità di 1) raggiungere scale temporali e metriche adeguate, 2) mantenere un grado sufficiente di discriminazione tra molecole in base alla loro natura chimica, 3) simulare i processi sperimentali per la fabbricazione di dispositivi elettronici organici, come la stampa a getto d'inchiostro, 4) essere integrate in processi di design ad alta efficienza ("high-throughput"). Il [secondo capitolo](#) di questa tesi introduce un metodo in grado di soddisfare tali requisiti, il quale si basa sulle due componenti fondamentali: *i*) l'utilizzo del modello coarse-grain Martini, che riesce a catturare efficientemente la chimica dei sistemi, e può essere utilizzato in schemi ad alta efficienza grazie alla sua modularità; *ii*) l'utilizzo di protocolli computazionali mirati a riprodurre i processi di fabbricazione usati in laboratorio. Nello stesso capitolo, il metodo viene inizialmente validato su una tipica cella fotovoltaica organica, con l'intento poi, di estenderne l'applicazione su qualsiasi dispositivo elettronico organico. Questo viene dimostrato concretamente nel [terzo capitolo](#), dove lo stesso metodo viene applicato su dispositivi termoelettrici organici. In entrambi i casi, le morfologie dei materiali organici simulati sono in accordo con i dati sperimentali corrispondenti, fornendo in aggiunta una visione a livello molecolare della struttura dei materiali e della loro evoluzione durante i processi di fabbricazione.

Un altro beneficio derivante dal metodo sviluppato nel secondo capitolo, è la possibilità di convertire facilmente la morfologia dal livello coarse-grain, al livello atomistico, tramite cosiddette tecniche di "backmapping", le quali fanno uso della corrispondenza esistente fra gli pseudo-atomi coarse-grain e gli atomi che rappresentano. Tali metodi permettono così di calcolare proprietà elettroniche basate su morfologie che rappresentano più da vicino l'organizzazione reale dei materiali organici. Il [quarto capitolo](#) mostra come sfruttare questi metodi andando a studiare la struttura all'interfaccia tra i due componenti necessari al funzionamento di tipiche celle fotovoltaiche organiche. Tale struttura determina il principale funzionamento di queste celle, e nel capitolo, è riportato come essa possa essere studiata nel dettaglio e in funzione dei loro processi di fabbricazione. Inoltre, il dettaglio atomistico permette di predire proprietà elettroniche importanti per il funzionamento delle celle fotovoltaiche organiche. Nello specifico, i risultati del quarto capitolo indicano che l'uso di molecole organiche con catene laterali molto polari introduce disordine energetico, con potenziali effetti negativi sul voltaggio prodotto dalle celle solari.

Fino a questo punto, le simulazioni su scale temporali e metriche più ampie sono state basate sul modello coarse-grain Martini. Alcune limitazioni di questo modello vengono studiate dettagliatamente nel [quinto capitolo](#), le cui conclusioni si focalizzano sull'importanza della densità delle particelle che vengono simulate, e come questa può essere influenzata drammaticamente dalle distanze di legame intramolecolari. Un uso distratto di tali distanze può portare a deviazioni dal corretto funzionamento del modello Martini. Sulla base di questi risultati, vengono chiarite delle linee guida per il corretto uso del modello; inoltre, il capitolo ne suggerisce spunti per il miglioramento, formando la base per una nuova versione del modello stesso.

La comprensione delle limitazioni del modello coarse-grain Martini, descritte nel quinto capitolo, ne hanno dato il via allo sviluppo di una nuova versione del, denominata *Martini 3.0*. La caratteristica chiave del nuovo modello è un miglior bilanciamento fra le particelle di diverse dimensioni utilizzate nelle simulazioni. Il [sesto capitolo](#) discute la nuova parametrizzazione, le caratteristiche, e l'efficienza di Martini 3.0 concentrandosi su molecole organiche cicliche, le quali sono particolarmente rilevanti nella simulazione di materiali organici, facilitando l'applicazione del metodo in questi sistemi.

In conclusione, questa tesi suggerisce molteplici sviluppi ed estensioni, compresa la possibilità di simulare un numero sempre maggiore di molecole organiche, e di connettere la morfologia del materiale organico alle proprietà elettroniche fondamentali per il funzionamento del dispositivo risultante. Nel loro insieme, i risultati di questa tesi contribuiscono a creare le fondamenta di un'era dove il design di dispositivi elettronici organici viene guidato da modelli computazionali e simulazioni.

List of Publications

- [R. Alessandri](#), J. J. Uusitalo, A. H. de Vries, R. W. A. Havenith, S. J. Marrink, *Bulk Heterojunction Morphologies with Atomistic Resolution from Coarse-Grain Solvent Evaporation Simulations*, *J. Am. Chem. Soc.* **2017**, *139*, 3697–3705.
- L. Qiu[†], J. Liu[†], [R. Alessandri](#), X. Qiu, M. Koopmans, R. W. A. Havenith, S. J. Marrink, R. C. Chiechi, L. J. A. Koster, J. C. Hummelen, *Enhancing Doping Efficiency by Improving Host-Dopant Miscibility for Fullerene-Based n-Type Thermoelectrics*, *J. Mater. Chem. A* **2017**, *5*, 21234–21241.
- J. Liu[†], L. Qiu[†], [R. Alessandri](#), X. Qiu, G. Portale, J. Dong, W. Talsma, G. Ye, A. A. Sengrigan, P. C. T. Souza, M. A. Loi, R. C. Chiechi, S. J. Marrink, J. C. Hummelen, L. J. A. Koster, *Enhancing Molecular n-Type Doping of Donor-Acceptor Copolymers by Tailoring Side Chains*, *Adv. Mater.* **2018**, 1704630.
- [R. Alessandri](#), H. Zulfikri, J. Autschbach, H. Bolvin, *Crystal Field in Rare-Earth Complexes: from Electrostatics to Bonding*, *Chem. Eur. J.* **2018**, *24*, 5538.
- S. Sami, P. A. B. Haase, [R. Alessandri](#), R. Broer, R. W. A. Havenith, *Can the Dielectric Constant of Fullerene Derivatives Be Enhanced by Side Chain Manipulation? A Predictive First Principles Computational Study*, *J. Phys. Chem. A* **2018**, *122*, 3919–3926.
- [R. Alessandri](#)[†], P. C. T. Souza[†], S. Thallmair, M. N. Melo, A. H. de Vries, S. J. Marrink, *Pitfalls of the Martini Model*, *J. Chem. Theory Comput.* **2019**, DOI: 10.1021/acs.jctc.9b00473.
- P. C. T. Souza[†], S. Thallmair[†], P. Conflitti, J. C. Ramírez Palacios, [R. Alessandri](#), S. Raniolo, V. Limongelli, S. J. Marrink, *Protein-Ligand Binding with the Coarse-Grained Martini Model*, submitted (2019).
- S. Sami, [R. Alessandri](#), R. Broer, R. W. A. Havenith, *Molecular Origin and Frequency Dependent Response of High Dielectric Constant Organic Semiconductors*, submitted (2019).
- A. S. Bondarenko, I. Patmanidis, [R. Alessandri](#), P. C. T. Souza, A. H. de Vries, S. J. Marrink, T. L. C. Jansen, J. Knoester, *Multiscale Modeling of Structural and Optical Properties of Complex Supramolecular Aggregates*, submitted (2019).
- [R. Alessandri](#), S. Sami, J. Barnoud, A. H. de Vries, S. J. Marrink, R. W. A. Havenith, *Polar Side Chain-Induced Disorder of Charge Carrier Energy Levels of Organic Semiconductors*, in preparation (2019).

[†]Equal contribution.

- P. C. T. Souza, R. Alessandri, *et al.*, *Martini 3.0: a General Purpose Force Field for Coarse-Grain Molecular Dynamics*, in preparation (2019; [open-beta version available at cgmartini.nl](#)).
- R. Alessandri, J. Barnoud, I. Patmanidis, A. H. de Vries, P. C. T. Souza, S. J. Marrink, *Martini 3.0 Coarse-Grained Force Field: Ring Structures*, in preparation (2019).

Associated data and code available online at:

- <http://cgmartini.nl>
 - P3HT, PCBM, and chlorobenzene Martini 2.2 force field files
 - PTEG-1, PP, N-DBMI, and TEG-DMBI Martini 2.2 force field files
- https://figshare.com/authors/Riccardo_Alessandri/4043948
 - P3HT, PCBM, and chlorobenzene GROMOS 53A6 atomistic force field files
 - PTEG-1, PP, and N-DBMI GROMOS 53A6 atomistic force field files
- <https://github.com/ricalessandri/>
 - script to run solvent evaporation simulations
 - script to compute scattering curves
 - script to “polymerize” atomistic P3HT

Acknowledgments

If my PhD time was so much stimulating and fun, even if challenging at times, a big part of the credits go to the many people which helped me and inspired me in different ways along the road.

Siewert-Jan, first of all, thanks for the nice atmosphere that you and Alex foster in the group, that's very valuable. I feel that the group is a very nice place where to grow as a scientist. Thanks also for the key insights you provided along the way, and the quick and sharp feedback you delivered on anything I would send you. I have learned many things from you, also non strictly-speaking scientific.

Ria, you have always been an inspiring person to me, from the first day of my TCCM master to the last suggestions you gave on this thesis. Your personality inspired me to pursue a PhD, and this led to the booklet you are now holding: thank you for that. We definitely interacted much more during my master's than during my time as a PhD student; still, I am happy that we have some publications together: I have some papers with Ria Broer!

Alex, you are one of the greatest teachers I had the opportunity to learn from. Moreover, for any problem anybody has, you have a (half-working) script lying around in one of the few hundreds of folders of projects you have been involved in. That's remarkable! Thanks also for helping me improve a lot of drafts, and for the help with the Dutch summary.

Remco, thanks for keeping up my "QM side" despite I was being carried along more and more by the MD part of the work. You are a great teacher, I am still grateful to you for being a cornerstone, along with Ria, during my TCCM period. Besides, how could I forget the Skype interview I had with you and Rémi back in 2012? That changed a lot of things!

I am also indebted to professors David Beljonne, Peter Bobbert, and Shirin Faraji for taking the time to be part of the assessment committee of this thesis.

Paulo, I am grateful for the many discussions we had about science or anything else. Working with you from the beginning of my PhD, starting with the "S-beads task force", had a profound impact on my scientific development. Thank you for sharing your knowledge and experience. Obrigado! I just keep it short by saying that I am going to miss closely collaborating with you. Well, wait, who said we should stop?

Selim, not only you are my longest-time TheoChem buddy but also fellow of many discussions at work, collaborations, and time outside the office. Thanks for the fun! Thanks also for hosting the nice holiday we did in Turkey last year. That was full of all those lekker dishes which you guys took from other cultures and just upgraded a little,

like the kefir-with-salt or the very-thin-pizza. Lastly, I am happy that you will be my paronymph.

Floris, we shared office for three years, but it felt like much longer—and I mean it in a good way! Thanks for the countless chats in several languages (often mixed up), and good time spent also outside work. Thanks also for having translated my summary into Dutch. I am happy that we managed to keep in touch, I will see you in Japan! Thanks also to my current office mates, Haleh and Maria, for the very nice atmosphere. I always enjoy our chats.

Sebastian, I am very happy we ended up collaborating directly on a few projects. Thanks in particular for the many suggestions on the “S-beads manuscript” and for adding another very interesting shade of the problem. I also enjoyed the good time we spent together in the occasions we had outside work.

Ignacio, è sempre piacevole passare del tempo con te, sia a lavoro che in giro. Sei fra le persone più solari che io conosca, sempre tranquillo e positivo: qualità molto importanti! In bocca al lupo con la nuova sfida, sono sicuro che ti farai valere. Sono molto contento di averti come mio paronymph.

Pim, I enjoyed very much your company in the group from the very start of my PhD. I learned a lot from trying to reverse-engineer your presentation and writing skills. Good luck with the new job, you'll nail it! Jonathan, your python skills can perhaps only be topped by your friendliness. Thanks for the great help on tons of things. Thanks also to Carsten, to which I owe most of my still-not-quite-sufficient Dutch speaking proficiency. Edu, thanks for the random coffee breaks, being an active member of our sports group (which include also Jing, Selim, Maria, and Anna!), and for the nice dinners at your's, at our's, or in some other place. I would also like to mention Mayke and Harrie for the ACLO classes which recharge my batteries the most. Jordi, Maria, Siva, and Luis, for many nice dinners and parties. Luis, a special thanks for the nice atmosphere you bring to TheoChem. And, with Tenzin, thanks for helping out with the organization of the joint PhD defenses!

Of course, a big thanks also to the rest of the past and present members of the MD group. You also contributed to my well-being especially via labuitjes, borrels, and cookies: thanks Peter, Ilias, Tsjerk, Bart, Melanie, Liuyang, Мама, Fabian, Josef, Weria, Petteri, Helgi, Manel, Jaakko, JJ, and Clément. My second home, the TheoChem group, should also be acknowledged. Shirin, Wim, Piet, Luis, Siva, Wouter, Kathir, Kiana, Edison, Max, Goran, Andrii, Hilde, Gerrit-Jan, Tommy, Meilani, Maria, thanks for considering me part of the group despite I was at MD more often than not. I will miss in particular the Christmas potluck dinners and the lake outings (thanks Shirin for starting this new tradition)! A special thanks also to Bea, Anmara, and Henriët for being always so helpful and kind.

It was fun to interact not only within the MD and the TheoChem groups but also with the Theory of Condensed Matter group. I feel I learned a little more there too thanks to

Thomas and Jasper. I would also like to thank the people I collaborate with outside the theoretical groups, in particular Jian, Q, and Jan-Anton. Jian, thanks especially for the many interesting discussions and your enthusiasm in sharing your view on the behavior of so many interesting systems. I also enjoyed attending the FOM focus group meetings, with inspiring talks from many great colleagues. Grazie a Luca per l'ospitalità a Lione, per aver condiviso "ins and outs" sul modello Martini del fullerene, e per le chiacchierate a pranzo e nelle numerose pause caffè che hanno caratterizzato la mia visita a Lione. Finally, I should also thank Anna for the extra fun we had in our "home project"; so we also ended up having a manuscript together!

I really enjoyed co-organizing the Dutch MD days thanks to the help I received from Tomasz, Arjun, Adrien, Thejas, Phaeton, and Sudeshna. I am happy that my part is now in the good hands of Melanie, enjoy!

A special thanks to the "TCCM gang", Juan, Thomas, and Anna. The memories I have from the TCCM period are unforgettable, and I really like that we manage to keep in touch. I am really happy that you guys (and Mari!) are coming to Groningen for our defenses!

I want to thank the staff of the Bonifatius Hospital Lingen and Paracelsus-Klinik Osnabrück, and in particular Prof. Dr. med. Hans, Sebastian, Dominik (×2), Peter, Катюша, Teodor, and all the other members of the staff for their kindness and for all you have done for me, and for Anna, on those unexpected circumstances of about a year ago. Danke schön!

Un grazie agli amici di lunga data, Neg, Canna, Cone, Luchino, Davide, e Umbi, perchè quando torno è sempre una festa. Un grazie speciale a Giammy: nonostante viviamo in due paesi diversi, continuo ad imparare molto dal tuo "strange loop". Grazie anche per aver corretto la prima versione del riepilogo di questa tesi, il cui italiano lasciava molto a desiderare. A proposito, spero che questi ringraziamenti siano scritti in maniera decente!

Infine, un grazie alla mia famiglia per starmi vicino e avermi permesso di fare tutto questo in serenità: grazie davvero. Tutto sommato, la distanza può rafforzare alcuni rapporti, perchè può farti vivere in modo più consapevole i momenti passati insieme. Аня, thanks for all the support, without you I am sure that the PhD time would have been much more difficult. I love how our minds resonate and yet widen each other's. We went through some unexpected events last year, and I am thankful you were with me then. You made me appreciate many interesting things in life, with you I grew emotionally. Спасибо. Non vedo l'ora di iniziare la nostra prossima avventura!

September 2019

Riccardo

