Realization-dependent model of hopping transport in disordered media

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ABSTRACT

At low injection or low temperatures, electron transport in disordered semiconductors is dominated by phonon-assisted hopping between localized states. A very popular approach to this hopping transport is the Miller–Abrahams model that requires a set of empirical parameters to define the hopping rates and the preferential paths between the states. We present here a transport model based on the localization land-scape (LL) theory in which the location of the localized states, their energies, and the coupling between them are computed for any specific realization, accounting for its particular geometry and structure. This model unveils the transport network followed by the charge carriers that essentially consists in the geodesics of a metric deduced from the LL. The hopping rates and mobility are computed on a paradigmatic example of disordered semiconductor and compared with the prediction from the actual solution of the Schrödinger equation. We explore the temperature-dependency for various disorder strengths and demonstrate the applicability of the LL theory in efficiently modeling hopping transport in disordered systems.

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The classical description of electrical conduction in a semiconductor involves scattering of the electronic Bloch states on impurities or defects of the lattice. However, in nitride alloys,^{1,2} perovskites,^{3,4} or organic semiconductors,^{5–7} the random arrangements of the elements in the alloy, the different inter-atomic spacings, or the random orientation of the molecules destroy the translation invariance of the crystal. In some cases, the resulting random spatial fluctuations of the local material composition are strong enough to induce localization of a large proportion of the low-energy electronic and hole states.⁸ Consequently, at low temperatures and low carrier concentrations, the charge carrier transport does not follow anymore the classical picture, but is dominated instead by phonon-assisted hopping between these localized states.^{9,10}

In this situation, hopping transport can be modeled as a transport process on a graph where each state (or node) is associated with an average occupation probability, and each pair of states (or edge) is associated with a transition probability or hopping rate (only close states in the nearest-neighbor model or distant in the variable range model⁷). The dynamics of the process is then governed by a master equation that tracks down the time-evolution of the average occupation probability of each state.¹¹ In the steady state, the solution to the

master equation provides the equilibrium occupation probabilities and the steady state current. The input parameters to the master equation are the hopping rates, which are computed by evaluating the electron– phonon interaction between each pair of states. This requires knowledge of the position and spatial extent of the wave functions for all states as well as their respective energies. When the hops are due to acoustic phonons, the atomic displacements are described as longwavelength acoustic waves that are related to the elastic strain of the crystal, as described in the deformation potential theory.¹²

These quantities can be computed via *ab initio* atomistic methods,^{13–16} which become computationally very demanding for systems of reasonable size. Classically, this difficulty is circumvented by assuming *a priori* how the localized states are distributed in space and in energy, and by providing a functional form for the hopping rates between localized states. The Miller–Abrahams (MA) model corresponds to the specific case in which electronic states are supposed to decay exponentially with one uniform localization length: the hopping rates are thus exponentially decreasing functions of the distance between states with the same characteristic length.^{11,17} The free parameters of the model are fitted against experimental mobility curves. Although the MA model has been applied to a large range of organic materials^{18–20} or amorphous materials,^{21–23} one of its major drawbacks is that it relies on identical empirical parameters for all electronic states at all energies. Vukmirović and Wang²⁴ showed via *ab initio* calculations that the exact hopping rates and mobilities can deviate significantly from the MA model, in part because the MA model does not account for the complex overlaps between the wave functions of the associated electronic states.

In this paper, we present a model of hopping transport in disordered semiconductors based on the recently developed localization landscape (LL) theory²⁵ that bridges the gap between *ab initio* atomistic calculations and empirical models such as the MA model. Our approach takes into account the structural disorder of the system and gives access to specific localization effects without significant computational cost.²⁶ The main ingredient in the LL theory is the effective potential, which not only predicts the regions of localization of the eigenstates and their corresponding energies but also provides a fine estimate of the exponential decay of the wave functions away from their regions of existence. This enables us to compute hopping rates between localized states and, consequently, the mobility of the charge carrier as a function of the underlying disordered potential. We then compare these computed mobilities with mobilities based on exact eigenstate computations for a 2D disordered potential and analyze the dependency of the mobility against disorder strength.

To model the hopping transport, we associate to each electronic state *i* an average occupation probability f_i . The rate of change of this occupation probability is the net sum of all the outward hops from state *i* to any other state *j* (with hopping rate w_{ij}), and inward hops from any state *j* to the state *i* (with hopping rate w_{ji}). One must also account for the fact that a carrier can only hop from an occupied to an unoccupied state. The master equation therefore reads

$$\frac{df_i}{dt} = \sum_j \left[-w_{ij} f_i (1 - f_j) + w_{ji} f_j (1 - f_i) \right]. \tag{1}$$

The hopping rates between any two states maintain detailed balance in steady state and satisfy

$$\frac{w_{ij}}{w_{ji}} = \exp\left(\frac{E_i - E_j}{k_B T}\right),\tag{2}$$

where E_i and E_j are the energies of states *i* and *j*, respectively, k_B is the Boltzmann constant, and *T* is the temperature of the system. The presence of an electrostatic field **F** shifts the energy of each state, $E'_i = E_i - e \mathbf{F} \cdot \mathbf{r}_i$, where *e* is the charge of the carrier. This results in a greater number of hops in the direction of the field, and the emergence of a net current of charge carriers. The steady state current *J* in response to the applied field **F** (assumed here to be along the *x* direction) through the surface *S* (depicted in Fig. 1) is

$$J = \frac{e}{L} \sum_{\substack{x_i < x_s \\ x_j > x_s}} \sum_{\substack{y_j > x_s}} \left[-w_{ij}\bar{f}_i(1-\bar{f}_j) + w_{ji}\bar{f}_j(1-\bar{f}_i) \right],$$
(3)

where \overline{f}_i is the steady state occupation probability for state *i*, and x_s is the *x* coordinate of the surface *s*, *n* is the carrier density, and *L* is the length of the sample. The system considered here is periodic along the *x* direction, the periodicity being accounted for by adding or subtracting an energy term equal to *eFL* for hops crossing the left or right sides (these sides being then identical). The mobility μ is then given by $\mu = J/neF$.



FIG. 1. Schematic of hopping transport: under an applied electrostatic field F, electrons move by hopping (red arrows) between the localized electronic states (orange disks). The net current (green arrow) passing through the surface S (green dotted line) is calculated by subtracting the net flow of charge to the left from the net flow of charge to the right.

The wave functions ψ of the electronic states involved in the hopping process satisfy the Schrödinger equation,

$$-\operatorname{div}\left(\frac{\hbar^2}{2m}\nabla\psi\right) + V\psi = E\psi,\tag{4}$$

where $m(\mathbf{r})$ is the effective mass of the charge carrier (possibly, position-dependent), and $V(\mathbf{r})$ is the potential (in semiconductors, the conduction or valence band edge). The hopping rates between any two states ψ_i and ψ_j are obtained by applying the Fermi golden rule to the electron–phonon interaction,

$$w_{ij} = \frac{2\pi}{\hbar} \sum_{\mathbf{q}} |\langle \psi_j | \hat{H}_{ep} | \psi_i \rangle|^2 \, \delta(E_j - E_i \pm E_q) \left\{ n_B(E_q, T) + \frac{1}{2} \pm \frac{1}{2} \right\},$$
(5)

where H_{ep} refers to the Hamiltonian of the electron–phonon interaction, E_q is the energy of a phonon with wave vector modulus q, and $n_B(E_q, T)$ is the average occupation number of a phonon with energy E_q at temperature T (given by the Bose–Einstein statistics). For acoustic phonons treated in deformation potential theory, the hopping rate takes the value

$$w_{ij} = \frac{D^2 q_0^3}{8\pi^2 \rho_m \hbar c_s^2} M_{ij}^{q_0} \left\{ n_B + \frac{1}{2} \pm \frac{1}{2} \right\},\tag{6}$$

where *D* is the deformation potential constant, ρ_m is the mass density of the material, c_s is the speed of sound in the material, $q_0 = |E_i - E_i|/\hbar c_s$, and M_{ii}^{a0} is given by the following overlap integral:

$$M_{ij}^{q_0} = \int_{q=q_0} d\Omega_q \left| \int d\mathbf{r} \, e^{-i\mathbf{q}\cdot\mathbf{r}} \, \psi_i^*(\mathbf{r}) \psi_j(\mathbf{r}) \right|^2.$$
(7)

We see that this integral depends on the spatial extent of the wave functions, and that its value is determined by the regions where the product $|\psi_i(\mathbf{r})\psi_j(\mathbf{r})|$ is significant. Evaluating Eq. (6), therefore, requires knowledge of the energies, of the locations and of the spatial extents of the localized states. Solving the Schrödinger equation in

Eq. (4) to access these quantities is prohibitively expensive for large systems. In the MA model, this issue is bypassed by assuming that the localized functions exponentially decay in all directions with the same characteristic localization length *a*, leading to the following expression for the hopping rate:

$$w_{ij} = w_0 \exp\left(-\frac{2|\mathbf{r}_j - \mathbf{r}_i|}{a} - \frac{[E_j - E_i]_+}{k_B T}\right),$$
(8)

where w_0 is a typical escape frequency, and $[x]_+ = \max(x, 0)$. This expression corresponds to the variable-range hopping model introduced in Refs. 9 and 10. The electronic density of states (the distribution of E_i) is typically assumed to be the tail of a Gaussian or of an exponential function.²⁷ In addition, the parameters w_0 and *a* need to be empirically fitted to experimental data. This drastic oversimplification of the shapes, locations, and energies of the wave functions can lead to erroneous estimates of the hopping rates, and finally of the current flowing through the system.²⁴

The LL theory allows us to reliably build the hopping network and assess all input parameters of the master equation without solving the Schrödinger equation. The LL is defined as the solution to the related Dirichlet problem,

$$-\operatorname{div}\left(\frac{\hbar^2}{2m}\nabla u\right) + Vu = 1.$$
(9)

We present here the properties of the LL used in our study, a more extensive account of its mathematical basis being provided in the supplementary material. It was shown in Refs. 25, 26, 28, and 29 that the LL *u* enables us to define an effective potential $V_u(\mathbf{r}) := 1/u(\mathbf{r})$, which

- predicts the regions of the localization: they correspond to the basins of V_{u}^{25} (We will see later how to precisely define these basins.)
- provides an approximation of the fundamental eigenstate in each of these basins B_b^{-28}

$$\psi_i(\mathbf{r}) \sim u(\mathbf{r})|_{B_i},$$
 (10)

up to a multiplicative constant.

• provides an approximation E_i^* of the energy E_i of the local fundamental eigenstate ψ_{ij}^{29}

$$E_i \approx E_i^* = \left(1 + \frac{d}{4}\right) \times \min_{B_i}(V_u),\tag{11}$$

where d is the embedding dimension of the system.

• defines a so-called Agmon metric $g_E(\mathbf{r})$ and an Agmon distance $\rho_E(\mathbf{r}_1, \mathbf{r}_2)$ as

$$g_E(r) = \sqrt{\frac{2m}{\hbar^2} [V_u(\mathbf{r}) - E]_+},$$
 (12)

$$\rho_E(\mathbf{r}_1, \mathbf{r}_2) = \min_{\gamma(\mathbf{r}_1, \mathbf{r}_2)} \int_{\gamma} g_E(\mathbf{r}) \, ds, \tag{13}$$

where the minimum is taken over all paths γ connecting \mathbf{r}_1 to \mathbf{r}_2 . This distance allows us to derive an upper bound on the exponential decay of the localized wave function via Agmon's inequality,³⁰

$$\psi_i(\mathbf{r}) \lesssim e^{-\rho_{E_i}(\mathbf{r},B_i)}.$$
(14)

This expression can be considered as capturing very generally the quantum tunneling effect in the effective potential V_u : the eigenstate ψ_i decays exponentially wherever the effective potential is larger than E_i (in other words, in the barriers of V_u).

To illustrate our approach, we study the example of a 2D disordered potential $V(\mathbf{r})$ depicted in Fig. 2(a). It can be considered as the conduction band edge of a random alloy of the form $A_x B_{1-x}$, where Aand B are atoms placed at random on a square lattice of parameter a = 0.5 nm, over a domain of size 50×50 nm². The potential has a maximum strength of 500 meV, a value found in highly disordered semiconductors, ¹³ and is generated by smoothing out the local composition of the alloy to define a local material, similarly as in Ref. 31. The minimum value of the potential is set to 0, which is the most practical and efficient choice for computing the LL for this type of bounded potential (see Ref. 28, Sec. II D). A different value would not change significantly the results, as long as it stays in the same energy range than the typical energies involved.

To assess the accuracy of the model, we solve numerically and independently the Schrödinger equation with a finite element eigenvalue solver^{32,33} to retrieve the exact eigenstates. Figure 2(b) displays the low-energy localized eigenstates. These localized eigenstates are the nodes of the hopping transport network. The connectivity of this network can be visualized by examining the product $|\psi_i(\mathbf{r})\psi_j(\mathbf{r})|$, as plotted in Fig. 2(c). In parallel, the landscape equation in Eq. (9) is solved using a finite element method: Fig. 2(d) displays the 2D color-plot of the corresponding effective potential $V_u = 1/u$. One can see that the



FIG. 2. (a) Disordered potential with max amplitude of 500 meV. (b) The local fundamental eigenstates of the disordered potential shown in (a). (c) Normalized pairwise overlaps $|\psi_i(\mathbf{r})\psi_j(\mathbf{r})|$ between the fundamental eigenstates. (d) The effective potential V_u superimposed with the geodesics of the Agmon distance between the local minima of V_u corresponding to the fundamental eigenstates (purple lines).

basins of this effective potential (in dark blue) correspond to the locations of the eigenstates.

The input parameters of the model are the energies of the states and the hopping rates between pairs of states. The former are estimated inside each basin using Eq. (11). The latter require first to compute the Agmon distance $\rho_{E_i}(\mathbf{r}, B_i)$ between each point of the domain and each basin B_i , see Eqs. (12) and (13). This can be efficiently done using a fast marching algorithm.^{34,35} We then compute between each pair of basin minima of V_u (indexed by *i* and *j*) the geodesics of $\rho_{E_i}(\mathbf{r}, B_i) + \rho_{E_j}(\mathbf{r}, B_j)$. Superimposing these geodesics (in purple) over the effective potential in Fig. 2(d), we clearly see that the network of geodesics replicates the network of pair-wise products already observed in Fig. 2(c). Very generally, this approach allows us to reveal the percolation network of charge carrier trajectories giving birth to a macroscopic current and to measure its statistical geometrical properties.³⁶

This Agmon distance provides a straightforward way to reconstruct estimates $\psi_i^{(u)}$ of the eigenstates ψ_i

$$\psi_i^{(u)}(\mathbf{r}) = c_i \begin{cases} E_i^* \ u(\mathbf{r}) & \text{inside } B_i, \\ \exp\left(-\rho_{\bar{E}_i}(\mathbf{r}, B_i)\right) & \text{outside } B_i, \end{cases}$$
(15)

where c_i is a normalization constant, the basin B_i is defined as the connected domain around the local minimum of 1/u whose boundary is the level set $u(\mathbf{r}) = 1/E_i^*$ [E_i^* being defined in Eq. (11)], and \overline{E}_i is another approximation of the state energy that we discuss in the next paragraph. Through this definition, the reconstructed wave function $\psi_i^{(u)}(\mathbf{r})$ is everywhere continuous.

We need here to distinguish between the estimated energy E_i^* of the localized state given by Eq. (11) and the energy \bar{E}_i entering the Agmon metric in Eqs (12) and (15). Although Eq. (14) holds when using the energy of the state to compute the distance ρ_{E_2} a tighter bound can be obtained in practice by using a smaller value of the energy. Indeed, the Agmon distance corresponds to the path that minimizes the integral of Eq. (13), while the exact value of ψ_i at point **r** would be obtained by a weighted sum of all possible paths through a path integral formulation, this approach being, however, much more computationally expensive. Since all other paths have larger distances, using the Agmon distance leads to a slight overestimation of the wave function amplitude outside its basin, hence an overestimation of the hopping rates. This effect can be compensated very simply by reducing the value of the energy entering the Agmon metric. For all potential strengths studied in our work, we have found that a value \bar{E}_i = 1.3 × min_{B_i}(V_u) [instead of 1.5 in Eq. (11)] works satisfactorily. This trend needs to be investigated in future studies.

The last step consists in computing the hopping rates w_{ij} defined by Eq. (6). In Fig. 3, we compare the hopping rates w_{ij} computed (i) from the exact eigenstates, (ii) from the localization landscape (LL) theory, and (iii) from the MA model. To that end, we use material parameters similar to those of disordered alloys of InGaN: D = 8.3 eV, $c_s = 8 \times 10^3 \text{ ms}^{-1}$, and $\rho_m = 6150 \text{ kgm}^{-3}$. The parameters of the MA model are obtained by a least squares fit of the logarithms of the matrix elements calculated from the exact eigenvalues. We see in Fig. 3(a) that the hopping rates, both for the exact eigenstates and for the LL computations, are much more scattered than the simple straight line corresponding to the MA model. Figure 3(b) shows a direct comparison between exact and LL-based rates. The upper-right part of the scatterplot shows that for the larger values of $M_{ij}^{q_0}$ (above 10^{10} , the ones relevant for transport), both computations tend to be very similar.

We plug these computed hopping rates into Eq. (1) and solve the master equation by a Newton–Raphson method to obtain the steady state occupation probabilities, with an initial guess for the occupation probabilities given by Fermi–Dirac statistics. For our results, we have placed the Fermi level 20 meV below the ground state, which is a typical value due to donor states in nitride-based semiconductors. Another possibility would be to change the Fermi level with temperature in order to keep a constant electron concentration. Our simulations showed that this does not affect the graph of the computed mobilities (the current density being divided by the electron concentration in order to obtain the mobility).

Figure 4 compares mobility vs temperature curves obtained by solving the master equation using parameters derived from the exact solution of the Schrödinger equation (solid lines), and the ones resulting from the LL-based solution of the master equation (dashed lines). The lines represent the log-average over 50 realizations, while the shaded area corresponds to one standard deviation of $\ln(\mu)$ around its average. This lognormal dispersion of the values of mobility around



FIG. 3. (a) Scatter plots of $M_{ij}^{q_0}$, the spatial component of the hopping rates [see Eq. (7)] computed with the exact eigenstates (blue dots) and with the LL-based states (orange dots), as a function of the distance between the states. In red, we display the exponential fit used in the Miller–Abrahams model, $M_{ij}^{q_0} = \exp(-r_{ij}/a)$. (b) Comparison between the hopping rates based on the exact eigenstates w_{ij} (vertical axis) and the LL-based states w_{ij}^u (horizontal axis) for 50 realizations of the disordered potential and three different ranges of hopping distances between localized states: (5–6 nm) (blue), (15–16 nm) (orange), and (25–26 nm) (green). The line y = x is represented by a black dashed line. One can see that the largest hopping rates, which are the main contributors to the mobility, are very well approximated by the LL approach.

Hamilton⁴⁰

the average is reminiscent of the geometric average appearing in the

states or both fundamental and excited states (disorder strength is 500 meV). The material parameters entering Eq. (6) are chosen as follows: $D = 8.3 \,\mathrm{eV}, c_{\mathrm{s}}$ = 8 imes 10 3 ms $^{-1}$, and ho_m = 6150 kgm $^{-3}$

conductivity of a random two-phase system.³⁷ The LL-based computations are shown to be in very good agreement with the exact eigenstate-based computations on a wide range of temperatures, while being about four times faster for a 2D system of size 800×800 . Note that most of the computation time is spent computing the Agmon distance for which we used a very standard method. One can hope to improve this computational gain in the future, for larger simulations, especially when self-consistently solving Schrödinger and Poissontransport equations.31

One may wonder how these mobility curves compare with Mott's

analytical expression of the conduction in variable range hopping.9

Mott's formula is valid under a certain number of assumptions:³⁸ (i)

The hops are supposed to be performed from a state at the Fermi level

to a higher state; (ii) although the hops can be performed at any dis-

tance (variable-range hopping), the attenuation length α for the

hydrogen-like localized wave functions is supposed to be uniform; (iii)

The density of states is supposed to be constant (within a band of bandwidth B). Such is not the case in our study because the states are obtained from a random potential. The bottom and localized states

therefore belong to a Lifshitz tail of the density of states (of exponential

shape), voiding the hypotheses required by Mott's law. Pollak³⁹ and

 $\exp\left(-T^{-(p+1)/(p+4)}\right)$ in 3D for a power-law density of states with

exponent p. In 1975, Efros and Shklovskii obtained a different expo-

nent by introducing Coulomb interaction and a perturbation to the

density of states near the Fermi level.⁴¹ No analytical law exists in the

case corresponding to our computations. However, comparing our

obtained independently a conductivity

computation. Involving more excited states increases the mobility at higher temperature (inset in Fig. 4), but we chose to focus in this study on the conduction induced by the lower energy states.

In summary, the LL-based approach to hopping transport allows us to assess efficiently the carrier mobility in a highly disordered or random medium, taking into account the specific characteristics of the disorder at the nanoscale without having to solve the Schrödinger equation for a large number of states. This model not only encompasses naturally variable range hopping but also provides a realizationdependent visualization of the transportation network through electron-phonon coupling between states, revealing the nature of the percolation paths followed by the charge carriers. It is, therefore, a very handy theoretical and practical tool for understanding the features of electronic transport at low temperatures, and for testing extreme deviations of the conductivity through rare events.

remains valid: both are in very good agreement, which is the core mes-

One has to note that, at higher temperatures, the value of the mobility depends on the number of electronic states included in the

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sage of this paper.

See the supplementary material that presents a summary of the mathematical derivations of the main properties of the LL. The localization landscape is a mathematical theory aimed at describing, assessing, and computing the role of disorder and geometry in the shaping of standing waves, i.e., the eigenfunctions of wave operators.

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AUTHOR DECLARATIONS **Conflict of Interest**

The authors have no conflicts to disclose.

Author Contributions

Abel Thayil: Conceptualization (equal); Data curation (lead); Formal analysis (lead); Investigation (equal); Methodology (equal); Software (lead); Validation (lead); Visualization (lead); Writing - original draft (equal); Writing - review & editing (equal). Marcel Filoche: Conceptualization (lead); Funding acquisition (lead); Investigation (equal); Methodology (equal); Project administration (lead); Resources (lead); Supervision (lead); Validation (equal); Writing - original draft (equal); Writing - review & editing (lead).

DATA AVAILABILITY

The data that support the findings of this study are available within the article and its supplementary material.

REFERENCES

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¹P. Sohi, J.-F. Carlin, and N. Grandjean, "Alloy disorder limited mobility of InGaN two-dimensional electron gas," Appl. Phys. Lett. 112, 262101 (2018). ²C. Weisbuch, S. Nakamura, Y.-R. Wu, and J. S. Speck, "Disorder effects in nitride semiconductors: Impact on fundamental and device properties," Nanophotonics 10, 3-21 (2020).



FIG. 4. Comparison of the temperature-dependent hopping mobility obtained from

computations based on solving the exact eigenstates (solid lines) with the LL-based approach (dashed lines), for three different disorder strengths and log-averaged

over 50 realizations. The shaded areas correspond to the standard deviation of the

logarithm of the computed mobility. The result of the MA computation is also provided for one value of the disorder strength (red solid line). (Inset) Mobility as a

function of the temperature compared when using either only the fundamental

- ³M. Baranowski, J. M. Urban, N. Zhang, A. Surrente, D. K. Maude, Z. Andaji-Garmaroudi, S. D. Stranks, and P. Plochocka, "Static and dynamic disorder in triple-cation hybrid perovskites," J. Phys. Chem. C **122**, 17473–17480 (2018).
- ⁴S. Singh, C. Li, F. Panzer, K. L. Narasimhan, A. Graeser, T. P. Gujar, A. Köhler, M. Thelakkat, S. Huettner, and D. Kabra, "Effect of thermal and structural disorder on the electronic structure of hybrid perovskite semiconductor CH₃NH₃PbI₃," J. Phys. Chem. Lett. 7, 3014–3021 (2016).
- ⁵D. P. McMahon and A. Troisi, "Organic semiconductors: Impact of disorder at different timescales," ChemPhysChem 11, 2067–2074 (2010).
- ⁶A. Troisi and G. Orlandi, "Charge-transport regime of crystalline organic semiconductors: Diffusion limited by thermal off-diagonal electronic disorder," Phys. Rev. Lett. **96**, 086601 (2006).
- ⁷A. V. Nenashev, J. O. Oelerich, and S. D. Baranovskii, "Theoretical tools for the description of charge transport in disordered organic semiconductors," J. Phys.: Condens. Matter 27, 093201 (2015).
- ⁸P. W. Anderson, "Absence of diffusion in certain random lattices," Phys. Rev. 109, 1492–1505 (1958).
- ⁹N. F. Mott and E. A. Davis, *Electronic Processes in Non-Crystalline Materials*, 2nd ed., The International Series of Monographs on Physics (Oxford University Press, 2012).
- ¹⁰B. I. Shklovskii and A. L. Efros, *Electronic Properties of Doped Semiconductors*, Springer Series in Solid-State Sciences, Vol. 45 (Springer Berlin Heidelberg, 1984).
- ¹¹A. Miller and E. Abrahams, "Impurity conduction at low concentrations," Phys. Rev. 120, 745–755 (1960).
- ¹²J. Bardeen and W. Shockley, "Deformation potentials and mobilities in non-polar crystals," Phys. Rev. 80, 72–80 (1950).
 ¹³M. Mladenović and N. Vukmirović, "Charge carrier localization and transport
- ¹⁵M. Mladenović and N. Vukmirović, "Charge carrier localization and transport in organic semiconductors: Insights from atomistic multiscale simulations," Adv. Funct. Mater. 25, 1915–1932 (2015).
- ¹⁴J. A. Chan, J. Z. Liu, and A. Zunger, "Bridging the gap between atomic microstructure and electronic properties of alloys: The case of (In,Ga)N," Phys. Rev. B 82, 045112 (2010).
- ¹⁵A. Massé, P. Friederich, F. Symalla, F. Liu, R. Nitsche, R. Coehoorn, W. Wenzel, and P. A. Bobbert, "*Ab initio* charge-carrier mobility model for amorphous molecular semiconductors," Phys. Rev. B **93**, 195209 (2016).
- ¹⁶A. Massé, P. Friederich, F. Symalla, F. Liu, V. Meded, R. Coehoorn, W. Wenzel, and P. A. Bobbert, "Effects of energy correlations and superexchange on charge transport and exciton formation in amorphous molecular semiconductors: An *ab initio* study," Phys. Rev. B **95**, 115204 (2017).
- ¹⁷T. Kasuya and S. Koide, "A theory of impurity conduction. II," J. Phys. Soc. Jpn. 13, 1287–1297 (1958).
- ¹⁸M. C. J. M. Vissenberg and M. Matters, "Theory of the field-effect mobility in amorphous organic transistors," Phys. Rev. B 57, 12964–12967 (1998).
- ¹⁹W. F. Pasveer, J. Cottaar, C. Tanase, R. Coehoorn, P. A. Bobbert, P. W. M. Blom, D. M. de Leeuw, and M. A. J. Michels, "Unified description of charge-carrier mobilities in disordered semiconducting polymers," Phys. Rev. Lett. 94, 206601 (2005).
- ²⁰J. O. Oelerich, D. Huemmer, M. Weseloh, and S. D. Baranovskii, "Concentration dependence of the transport energy level for charge carriers in organic semiconductors," Appl. Phys. Lett. **97**, 143302 (2010).
- ²¹M. Grünewald and P. Thomas, "A hopping model for activated charge transport in amorphous silicon," Phys. Status Solidi B 94, 125–133 (1979).

- ²²C. Godet, "Hopping model for charge transport in amorphous carbon," Philos. Mag. B 81, 205–222 (2001).
- ²³K. Murayama, Y. Nomura, and T. Fujisaki, "Hopping transport at localized band tail states in amorphous hydrogenated silicon," Phys. Status Solidi A 207, 561–565 (2010).
- ²⁴N. Vukmirović and L.-W. Wang, "Carrier hopping in disordered semiconducting polymers: How accurate is the Miller–Abrahams model?," Appl. Phys. Lett. 97, 043305 (2010).
- ²⁵M. Filoche and S. Mayboroda, "Universal mechanism for Anderson and weak localization," Proc. Natl Acad. Sci. U. S. A. **109**, 14761–14766 (2012).
- ²⁶D. N. Arnold, G. David, D. Jerison, S. Mayboroda, and M. Filoche, "Effective confining potential of quantum states in disordered media," Phys. Rev. Lett. 116, 056602 (2016).
- ²⁷S. Baranovskii and O. Rubel, "Charge transport in disordered materials," in Springer Handbook of Electronic and Photonic Materials, edited by S. Kasap and P. Capper (Springer International Publishing, Cham, 2017), p. 1.
- ²⁸M. Filoche, M. Piccardo, Y.-R. Wu, C.-K. Li, C. Weisbuch, and S. Mayboroda, "Localization landscape theory of disorder in semiconductors. I. Theory and modeling," Phys. Rev. B **95**, 144204 (2017).
- ²⁹D. N. Arnold, G. David, M. Filoche, D. Jerison, and S. Mayboroda, "Computing spectra without solving eigenvalue problems," SIAM J. Sci. Comput. **41**, B69–B92 (2019).
- ³⁰P. D. Hislop and I. M. Sigal, *Introduction to Spectral Theory: With Applications to Schrödinger Operators*, Applied Mathematical Sciences (Springer-Verlag, 1996).
- ³¹C.-K. Li, M. Piccardo, L.-S. Lu, S. Mayboroda, L. Martinelli, J. Peretti, J. S. Speck, C. Weisbuch, M. Filoche, and Y.-R. Wu, "Localization landscape theory of disorder in semiconductors. III. Application to carrier transport and recombination in light emitting diodes," Phys. Rev. B 95, 144206 (2017).
- ³²Automated Solution of Differential Equations by the Finite Element Method: The FEniCS Book, Lecture Notes in Computational Science and Engineering, edited by A. Logg, K.-A. Mardal, and G. Wells (Springer-Verlag, 2012).
- ³³V. Hernandez, J. E. Roman, and V. Vidal, "SLEPc: A scalable and flexible toolkit for the solution of eigenvalue problems," ACM Trans. Math. Softw. 31, 351–362 (2005).
- ³⁴J. A. Sethian, "A fast marching level set method for monotonically advancing fronts," Proc. Natl Acad. Sci. U. S. A. 93, 1591–1595 (1996).
- ³⁵R. Kimmel and J. A. Sethian, "Computing geodesic paths on manifolds," Proc. Natl Acad. Sci. U. S. A. 95, 8431–8435 (1998).
- ³⁶V. Ambegaokar, B. I. Halperin, and J. S. Langer, "Hopping conductivity in disordered systems," Phys. Rev. B 4, 2612–2620 (1971).
- ordered systems," Phys. Rev. B 4, 2612–2620 (1971).
 ³⁷A. M. Dykne, "Conductivity of a two-dimensional two-phase system," Sov. Phys. JETP 32, 63 (1971), [A. M. Dykhne, Zh. Eksp. Teor. Fiz. 59, 110 (1970)].
- ³⁸N. Apsley and H. P. Hughes, "Temperature-and field-dependence of hopping conduction in disordered systems," Philos. Mag. **30**, 963–972 (1974).
- ³⁹M. Pollak, "A percolation treatment of dc hopping conduction," J. Non-Cryst. Solids 11, 1–24 (1972).
- ⁴⁰E. M. Hamilton, "Variable range hopping in a non-uniform density of states," Philos. Mag. 26, 1043–1045 (1972).
- ⁴¹A. L. Efros and B. I. Shklovskii, "Coulomb gap and low temperature conductivity of disordered systems," J. Phys. C 8, L49 (1975).