



## COMPUTATIONAL ASPECTS OF SOLID STATE TRANSPORT

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# INTRODUCTION

Overview over computational techniques for charged carrier transport in solid state materials in intermediate regimes.

- ▶ **3 Generations of solar cells**, varying in size (thin films) and technology (heterojunctions).
- ▶ Compromise between first principle modeling and actual device simulation  $\Rightarrow$  **bridge multiple scales in modeling**.
- ▶ Focus on two problem areas: **Methods for stiff transport systems and interaction with barriers**.

# Issues

- ▶ 'Larger' mean free path (compared to device size, 2G, thin films)  
⇒ non - Maxwellian effects ⇒ kinetic theory.
- ▶ Heterojunctions (3G): multiple materials; generate potential barriers due to jumps in the bandgap; band structure.
- ▶ Quantum effects: Present below  $50 - 100nm$  length scales at potential barriers.

## Model equations 02

1. **Semi - classical:** Boltzmann equation for electrons and holes.  
Collisions: mainly electron - phonon; Generation / Recombination:  
Auger, SRH, **Excitation by Photons.**
2. **Quantum effects:** Schrödinger, Wigner, density matrices, Green's functions. Transport not purely ballistic (temperature effects etc.)  
**⇒ mixed classical - quantum models.**

## OUTLINE 03

- ▶ Deterministic methods for systems of Boltzmann equations as an alternative to Monte Carlo.
  - **Multiple time scales**, steady state calculations.
  - Discretization methods, difference vs. spectral.
- ▶ Quantum mechanical interactions with potential barriers in otherwise classical simulations.
  - **Effective energy approaches** in semiclassical Monte Carlo codes.
  - Higher dimensional **scattering matrix** approaches.

## PART I: Deterministic methods for the BTE 05

$$\partial_t f^{(\nu)} + \nabla_x \cdot (f^{(\nu)} \nabla_p \mathcal{E}^{(\nu)}) - \nabla_p \cdot (f^{(\nu)} \nabla_x \mathcal{E}^{(\nu)}) = Q[f^{(\nu)}] + \nu R$$

$$\mathcal{E}^{(\nu)}(x, p) = B(p) + \nu V(x), \quad \nu = \pm 1$$

$f^{(\nu)}(x, p, t)$ : kinetic density,  $\nu = \pm 1$ : electrons and holes.

$V$  : Potential, computed from Poisson equation.

$B(p)$ : kinetic energy from the band diagram.

$Q$ : collisions with lattice vibrations (phonons).

$R$ : Generation / recombination (Recombination can happen on a much larger time scale.)

## Collisions: Fermi's Golden Rule

- ▶ **High temperature:** dominant mechanism = scattering with lattice vibrations (phonons)  $\Rightarrow$  **linear**.
- ▶ **FGR:** Scattering with the lattice results in a change of energy of  $\pm \hbar\omega \Rightarrow$  **sparse in energy**.

$$Q[f^{(\nu)}](x, p, t) = \int K(p, q) f^{(\nu)}(x, q, t) - K(q, p) f^{(\nu)}(x, q, t) dq$$

$$K(p, q) = \sum_{\sigma=\pm 1} s_{\sigma}(p, q) \delta(B(p) - B(q) + \sigma \hbar\omega)$$

## Expansion methods 06

Expand the density function  $f^{(\nu)}$  in basis function of the **kinetic energy**  $B$  of the electron and the **momentum direction**  $\kappa$ .

$$p = |p|\kappa, \quad \kappa \in \mathcal{S}_3, \quad |\kappa| = 1,$$

$$f^{(\nu)}(x, p, t) \approx \sum_{n=1}^N f_n^{(\nu)}(x, B(p), t) S_n(\kappa)$$

$S_n(\kappa)$ : Spherical harmonics.

**Advantage:** Fermi's Golden Rule ( $Q \approx \delta(B(p) - B(q) \pm \hbar\omega)$ ) becomes a difference operator in the new variable  $e = B(p)$ .

## A hyperbolic system in $(x, e)$ for the expansion coefficients

$$\partial_t f_n^{(\nu)} + \sum_m \nabla_x \cdot [a_{nm} f_m^{(\nu)}] - \nu \nabla_x V \cdot [b_{nm} + c_{nm} \partial_e] f_m^{(\nu)} = [\mathbf{Q} f^{(\nu)}]_n + \nu R_n$$

for the expansion coefficients  $f_n^{(\nu)}(x, e, t)$ ,  $e = B(p)$ .

### Advantages:

1.  $\mathbf{Q}$  is sparse and easily inverted  $\Rightarrow$  deal with stiffness using partially implicit methods. Compute steady states directly.
2. Use **symmetries** of the geometry for  $x \in \mathbb{R}^2$  and  $x \in \mathbb{R}^1$  simulations.
3. The hyperbolic system retains the same **entropy properties** as the original Boltzmann equation.

# Entropy

The relative entropy

$$-\int f(\ln f + \mathcal{E}) dx dp$$

for the resulting hyperbolic system increases

$\Rightarrow$  stability for the hyperbolic system

## Approaches (1)<sub>09</sub>

Discretizing the energy  $e = B(p)$ :

- ▶ Same as the spatial discretization  $\Rightarrow$  yields a positive operator (and guarantees positive densities).
- ▶ Spectral discretization of the energy using Hermite functions (in general: polynomials  $\times$  equilibrium distribution).

$$f_n^{(\nu)}(x, e) = \sum_k f_{nk}^{(\nu)}(x) P_k(e) \exp(-e)$$

cheaper, but limited in highly non - equilibrium regimes.

## Approaches (2)

### Transient vs. steady state

- ▶ **Transient:** Use hyperbolic methods for hyperbolic systems (WENO or DG, Carrillo, Gamba, Majorana, Shu).
- ▶ **Steady state:** Elliptic solvers in a weighted  $L^2$  space and Hermite polynomials in energy. (Heitzinger, Vasileska, CR), reduces to standard discretization for steady state drift - diffusion if only one basis function is taken.

# Simulation of an MOS-transistor

Electron density and energy; potential and lateral current component.

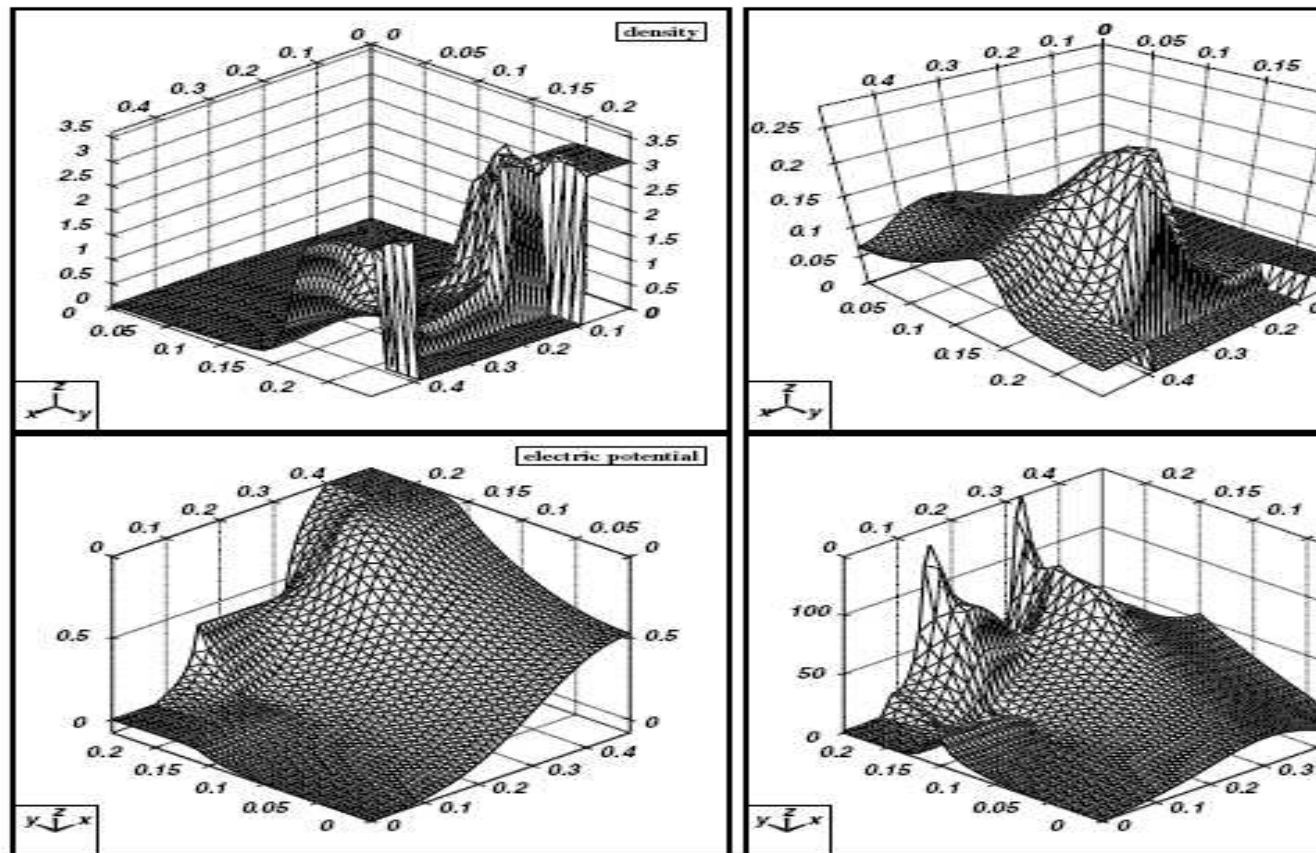


Fig. 11. MOSFET device. BTE results.  $t = 5$  ps. Top left: the charge density  $\rho$  ( $10^{-17} \text{ cm}^{-3}$ ); top right: the energy  $\mathcal{E}$  (eV)

# Non - Maxwellian effects

Moment distribution of the kinetic density at various points of real space  
 $x_1 = 50nm, f(50, p_1, p_{23})B(p).$

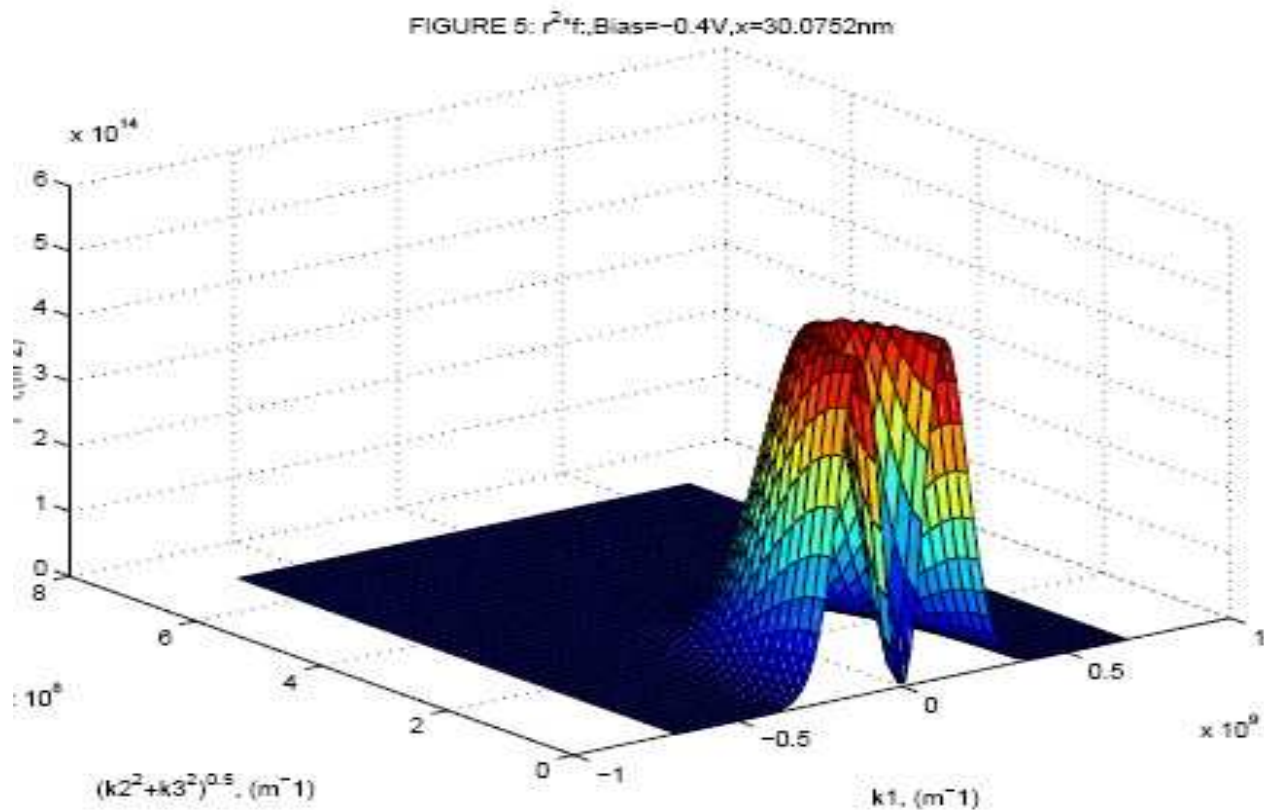


FIG. 5.  $r^2 * f$ : Bias = -0.4V,  $x = 30.0752nm$ .

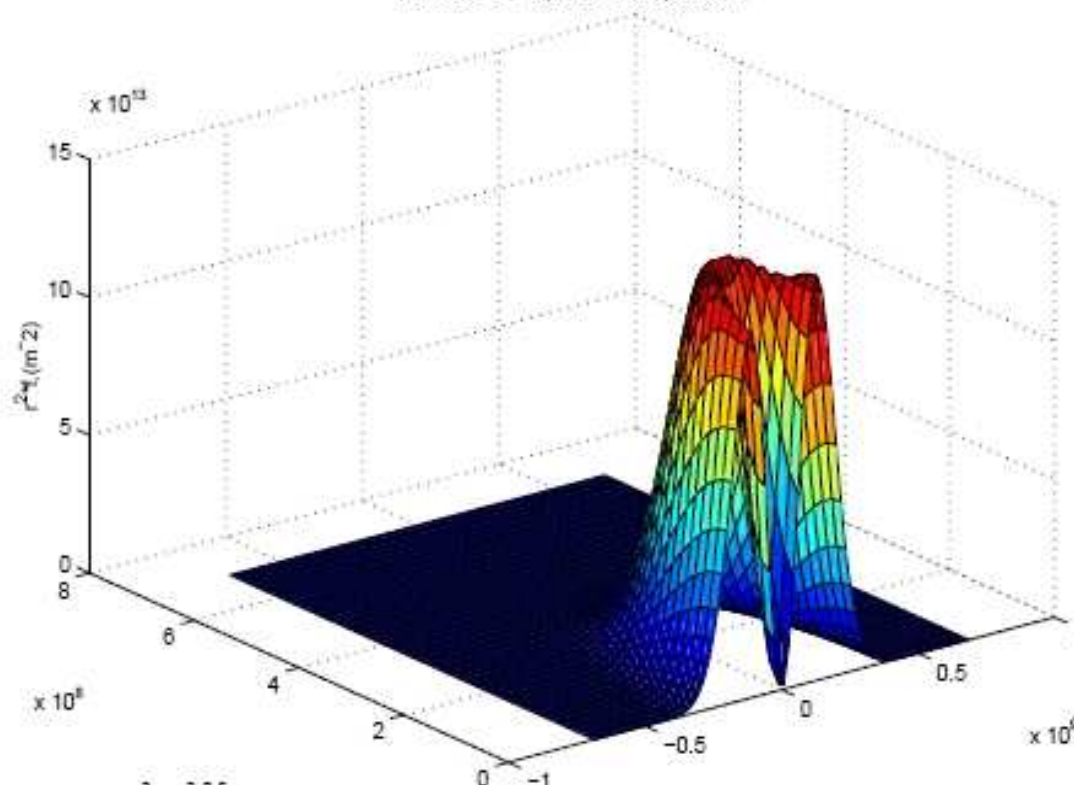
# Non - Maxwellian effects

Moment distribution of the kinetic density at various points of real space  
 $x_1 = 100nm \ f(100, p_1, p_{23})B(p).$

A MIXED SPECTRAL-DIFFERENCE METHOD

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FIGURE 6:  $r^2 f$ , Bias=-0.4V, x=50nm



# Non - Maxwellian effects

Moment distribution of the kinetic density at various points of real space  
 $x_1 = 150nm \ f(150, p_1, p_{23})B(p).$

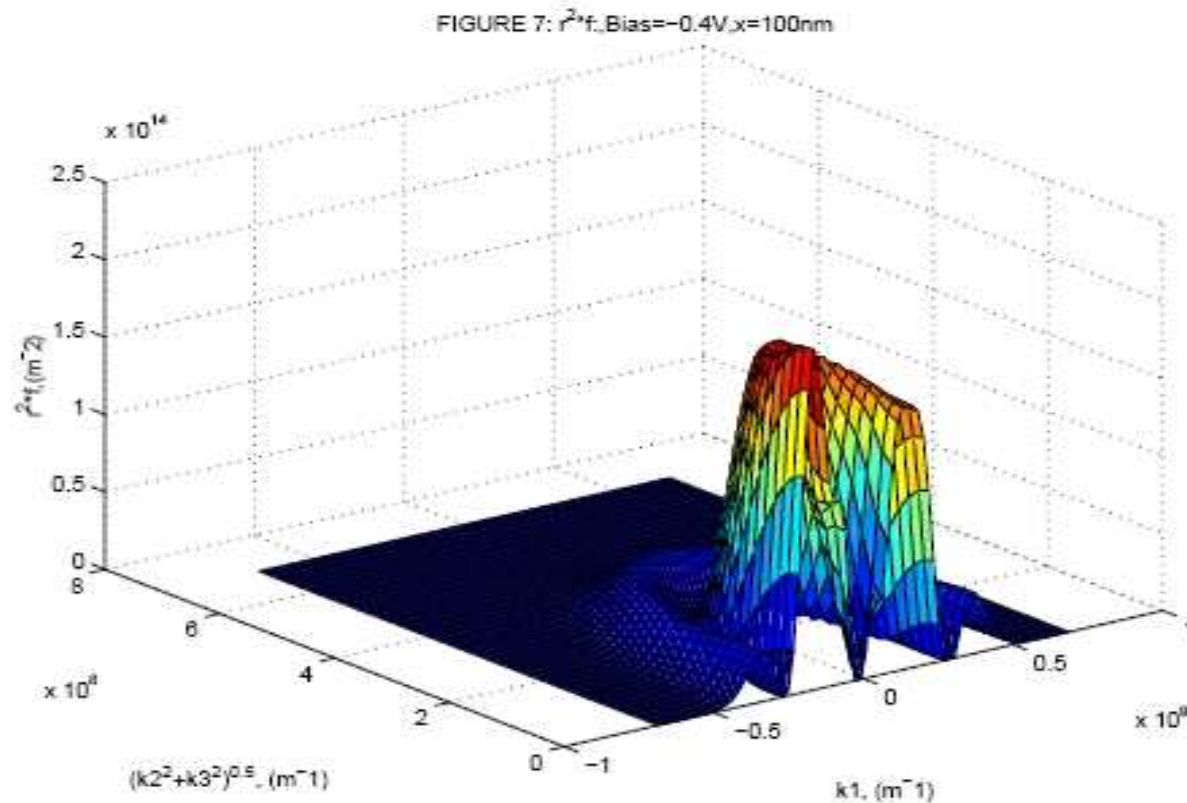


FIG. 7.  $r^2 * f$ : Bias = -0.4V, x = 100nm.

## Summary

- ▶ Expansion methods are practical for  $x \in \mathbb{R}^2$ . (3D possible but is HPC).
- ▶ Superior to MC in 2D if stiffness (generation / recombination) is included and steady states are needed.
- ▶ Easy to couple with Poisson, but **cannot** include many body theory beyond mean fields.

## PART II: Approximate quantum mechanics <sup>12</sup>

**Goal:** Include q.m. transport mechanisms approximately into an otherwise classical simulation.

- ▶ Interaction with barriers caused by jumps in bandgaps from one material to another in heterojunction devices.
- ▶ Heterojunction devices: MESFET, tunneling diodes, 3G solar cells.

## The Wigner Boltzmann equation 13

Equivalent to the Heisenberg equation for the density matrix of a mixed state (after Fourier transform).

$$f(x, p, t) = \mathcal{W}\rho(x, p, t) = \int \rho(x - \frac{\hbar}{2}\eta, x + \frac{\hbar}{2}\eta, t) e^{i\eta \cdot p} d\eta$$

$$\partial_t f^{(\nu)} + \mathcal{C}_W \{ \mathcal{E}^{(\nu)}, f^{(\nu)} \} - \nabla_p \cdot (f^{(\nu)} \nabla_x \mathcal{E}^{(\nu)}) = Q[f^{(\nu)}] + \nu R$$

$$\mathcal{C}_W \{ \mathcal{E}^{(\nu)}, f^{(\nu)} \} = \frac{i}{\hbar} \sum_{\sigma=\pm 1} \sigma \mathcal{E}^{(\nu)} \left( x - \frac{i\sigma\hbar}{2} \nabla_p, p + \frac{i\sigma\hbar}{2} \nabla_x \right) f^{(\nu)}$$

$\mathcal{C}_W$  converges in the limit  $\hbar \rightarrow 0$  to the classical commutator

$$\mathcal{C}_c = \nabla_p \mathcal{E}^{(\nu)} \cdot \nabla_x f^{(\nu)} - \nabla_x \mathcal{E}^{(\nu)} \cdot \nabla_p f^{(\nu)}.$$

## Problems:

- ▶ There is no first principle formulation for  $Q$ , other than oscillator bath. (Scattering on the qm level only given in a Green's function formulation.)
- ▶ The quantum commutator  $C_W$  is a pseudo differential operator whose kernel is not uniformly positive. ( $\Rightarrow$  negative particles because of violation of the Heisenberg principle  $\Rightarrow$  geometric explosion).
- ▶ Particles allow us to go beyond mean field theory.

2 approaches to model interaction with potential barriers rudimentarily on a q.m. level.

## Approach 1 : Effective energies<sub>15</sub>

**Idea:** Replace the action of the potential  $V$  on the particle by the action of an effective potential, which produces the same result in **local thermal equilibrium**.

## Local thermodynamic equilibrium:

- ▶ Zwanzig, Degond, Mehats, CR: Generalization of Levermore closures in the classical case.
- ▶ Local equilibrium defined as the **maximizer of the entropy under the constraint of a given observation.**

The relative Von Neumann entropy for the density matrix of a mixed state

$$S[\rho] = -\text{Trace}[\rho \cdot (\ln(\rho) + H - id)], \quad H = -\frac{\hbar}{2m} \Delta_x + V$$

The local thermal equilibrium  $f_{equ}^{(n)} = \mathcal{W}\rho_{equ}^{(n)}$

Given by the constrained optimization problem

$$S[\rho_{equ}^{(n)}] = \max\{S[\rho] : \rho(x, x) = n(x)\}, \quad n(x) = \int f(x, p) dp$$

$\rho_{equ}^{(n)}$  given in terms of an operator exponential and a Lagrange multiplier

$\lambda$

$$\rho_{equ}^{(n)}(x, y) = \mathcal{Exp}[-\mathcal{E}(i\hbar(\nabla_x - \nabla_y))\delta(x - y) - \lambda(x)\delta(x - y)]$$

$$f_{equ}^{(n)} = \mathcal{W}[\rho_{equ}^{(n)}] = e^{\mathcal{E}_{eff}(x, p)}$$

## Algorithm 18

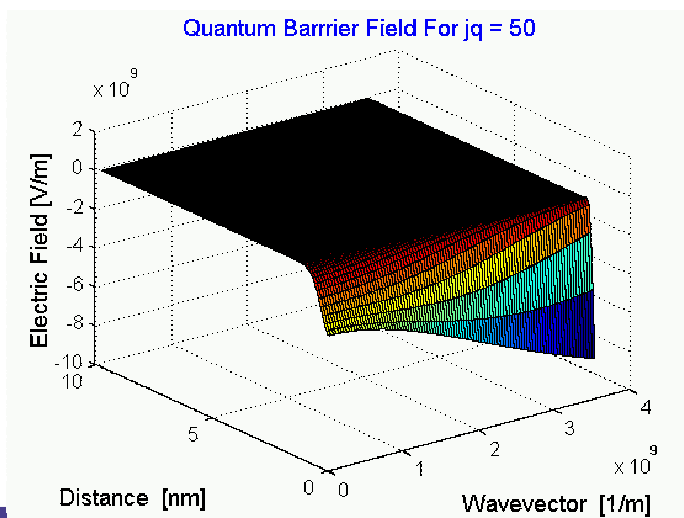
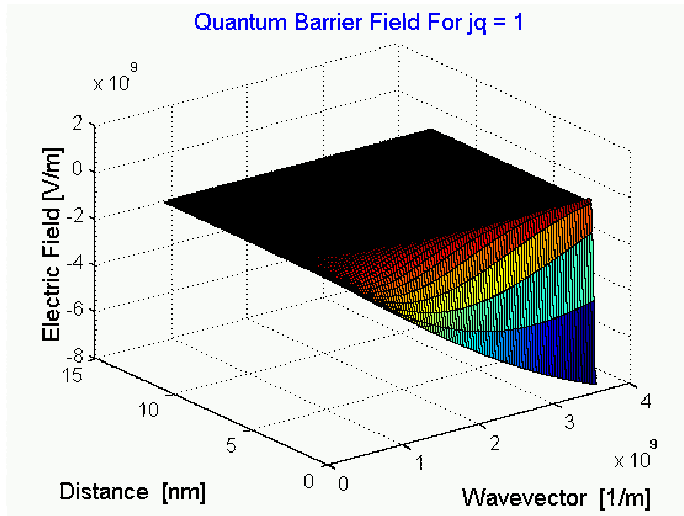
- (1) Given  $f(x, p, t) = \sum_k \delta(x - x_k) \delta(p - p_k)$
- (2) Compute  $n(x, t) = \int f(x, p, t) dp$  on a mesh by a cloud in cell method.
- (3) Compute  $f_{equ}^{loc} = f_{equ}^{loc}(n)$ : the entropy minimizer for the particle density  $n(x, t)$ .

$$\rho_{equ}^{loc}(x, y, t) = \exp[-\Delta \delta(x - y) - \lambda(x) \delta(x - y)]$$

$$\lambda : \rho_{equ}^{loc}(x, x, t) = n(x, t)$$

- (4) Compute the effective energy  $\mathcal{E}_{eff} = \frac{\mathcal{E}_q(x, p, \nabla_x, \nabla_p) f_{equ}^{loc}}{f_{equ}^{loc}}$
- (5) Move the particles according to the classical commutator with  $\mathcal{E}_{eff}$ .
- (6) Scatter according to classical collision operator

# Effective force for a step



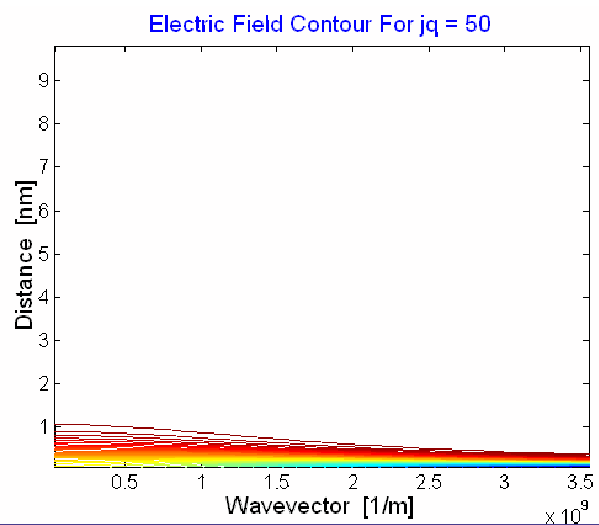
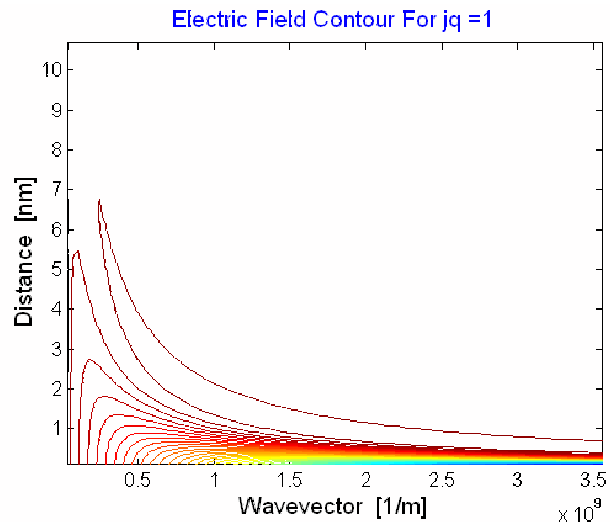
The resulting potential (or field) is dependent on the wave vector  $p$ !

Quantum corrected force for a step potential as a function of distance and wave vector

- low cross directional energy

- high cross directional energy

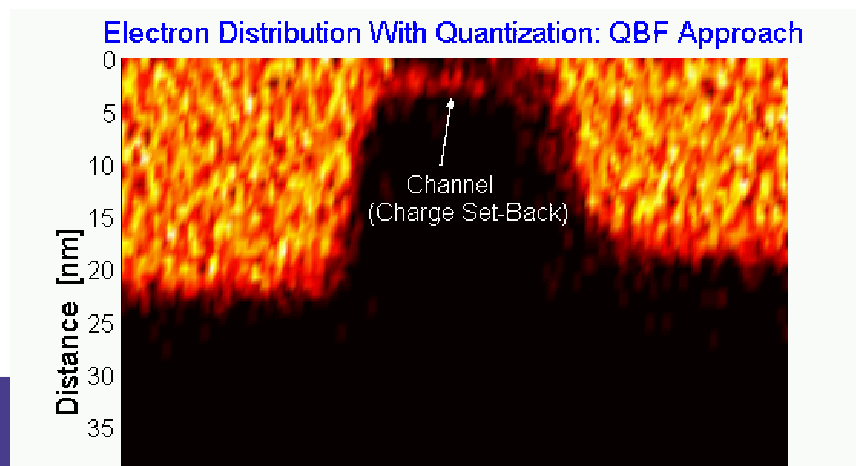
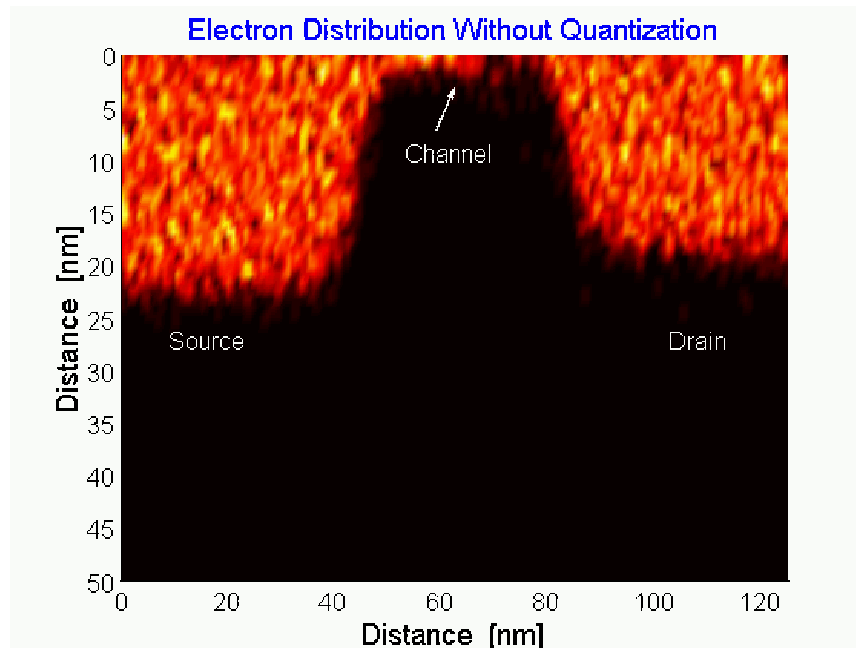
# Contours



High energy particles behave more classically.

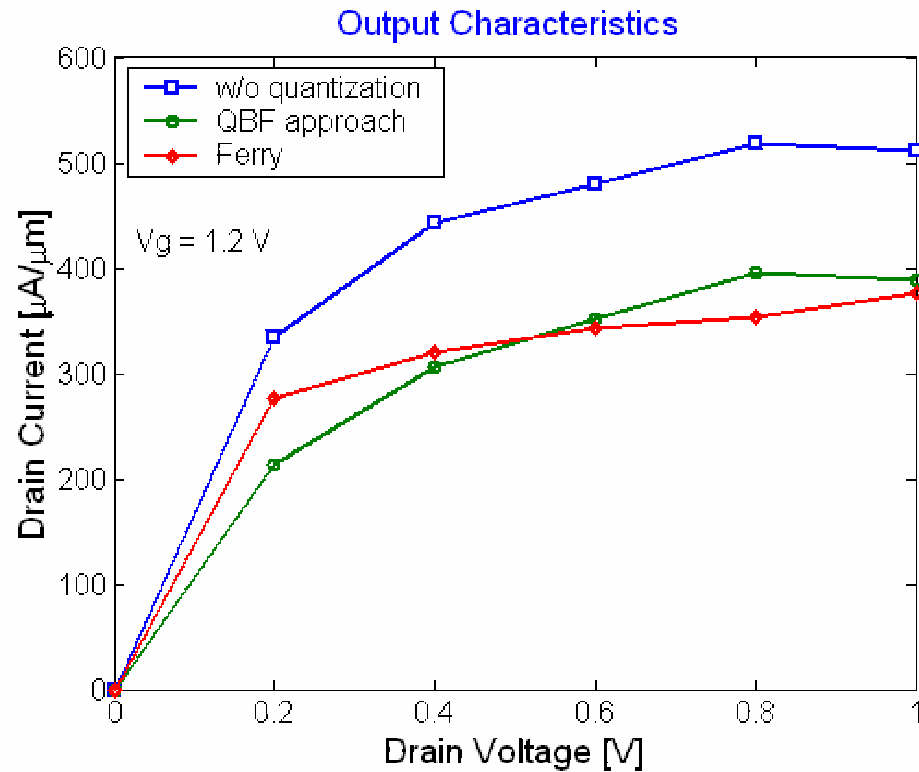
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# Charge Separation from the gate in a 20nm MOSFET



Particles move along the barrier at a distance due to the nonlocal interaction with the barrier -

# Current vs. Voltage



This reduces the output significantly

## Approach 2: Generalization of scattering matrix approaches<sub>20</sub>:

**Idea:** Use classical transport picture away from barriers.

$$\frac{dx}{dt} = \frac{p}{m}$$

Compute the probability of transmission / reflection by the barrier by solving a 1-D scattering problem for the Schrödinger equation exactly in the direction orthogonal to the barrier.

$$i\hbar\partial_t\psi = -\frac{\hbar^2}{2m}\partial_x^2\psi + V\psi, \quad V(x) = \begin{pmatrix} V_- & \text{for } x < 0 \\ V_+ & \text{for } x > 0 \end{pmatrix}$$

$$\psi(x, t) = \begin{pmatrix} \exp(i\frac{xp_-}{\hbar} - i\omega t) + R \exp(-i\frac{xp_-}{\hbar} - i\omega t) & \text{for } x < 0 \\ T \exp(i\frac{xp_+}{\hbar} - i\omega t) & \text{for } x > 0 \end{pmatrix}$$

$$p_+ = \sqrt{p_-^2 - m\Delta V}$$

For  $p_-^2 < m\Delta V$  this gives an evanescent transmitted wave, which is neglected in the semiclassical approximation.

$$T = \begin{pmatrix} \frac{2p_-}{p_- + p_+} & \text{for } p_-^2 > m\Delta V \\ 0 & \text{for } p_-^2 < m\Delta V \end{pmatrix}, \quad R = \begin{pmatrix} \frac{1-p_+}{p_- + p_+} & \text{for } p_-^2 > m\Delta V \\ 1 & \text{for } p_-^2 < m\Delta V \end{pmatrix}$$

## In higher dimensions (Jin, Novak '04)

The reflection / transmission coefficients and the transmitted momentum direction  $p_+$  depend also on the angle the wave impacts the interface.

write  $p_-$  as

$$p_- = \alpha_- \mathfrak{N} + \beta_- \mathfrak{T}, \quad p_+ = \alpha_+ \mathfrak{N} + \beta_+ \mathfrak{T},$$

$$\alpha_+^2 + \beta_+^2 = \alpha_-^2 + \beta_-^2 - m\Delta V$$

with  $\alpha_- = \mathfrak{N} \cdot p_-$  and  $\beta_- = \mathfrak{T} \cdot p_-$ .

( $\mathfrak{N}$ ,  $\mathfrak{T}$ : normal and tangent vector to the barrier.)

Yields  $R(\alpha_-, \beta_-)$  and  $T(\alpha_-, \beta_-)$  and  $\beta_+(\alpha_-, \beta_-)$

## Algorithm 24

Solve Newton equations for one time step

$$\tilde{x}(t + \Delta t) = x(t) + \frac{\Delta t}{m} p(t)$$

If  $\tilde{x}$  has crossed a barrier:  $p(t) = \alpha_- \mathfrak{N} + \beta_- \mathfrak{T}$

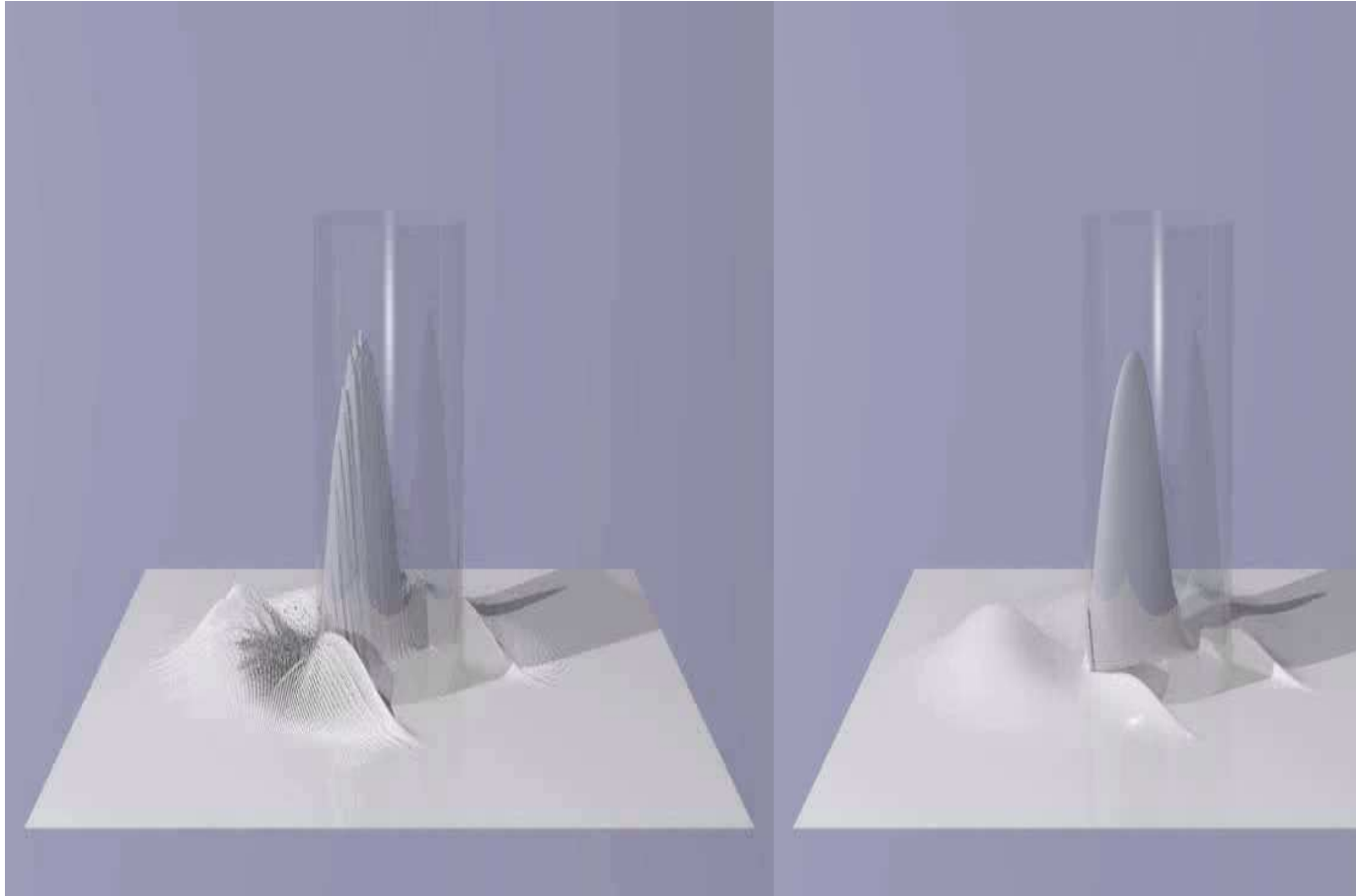
$$x(t + \Delta t) = \begin{pmatrix} \tilde{x}(t) & \text{with probability } T \\ x(t) & \text{with probability } R \end{pmatrix}$$

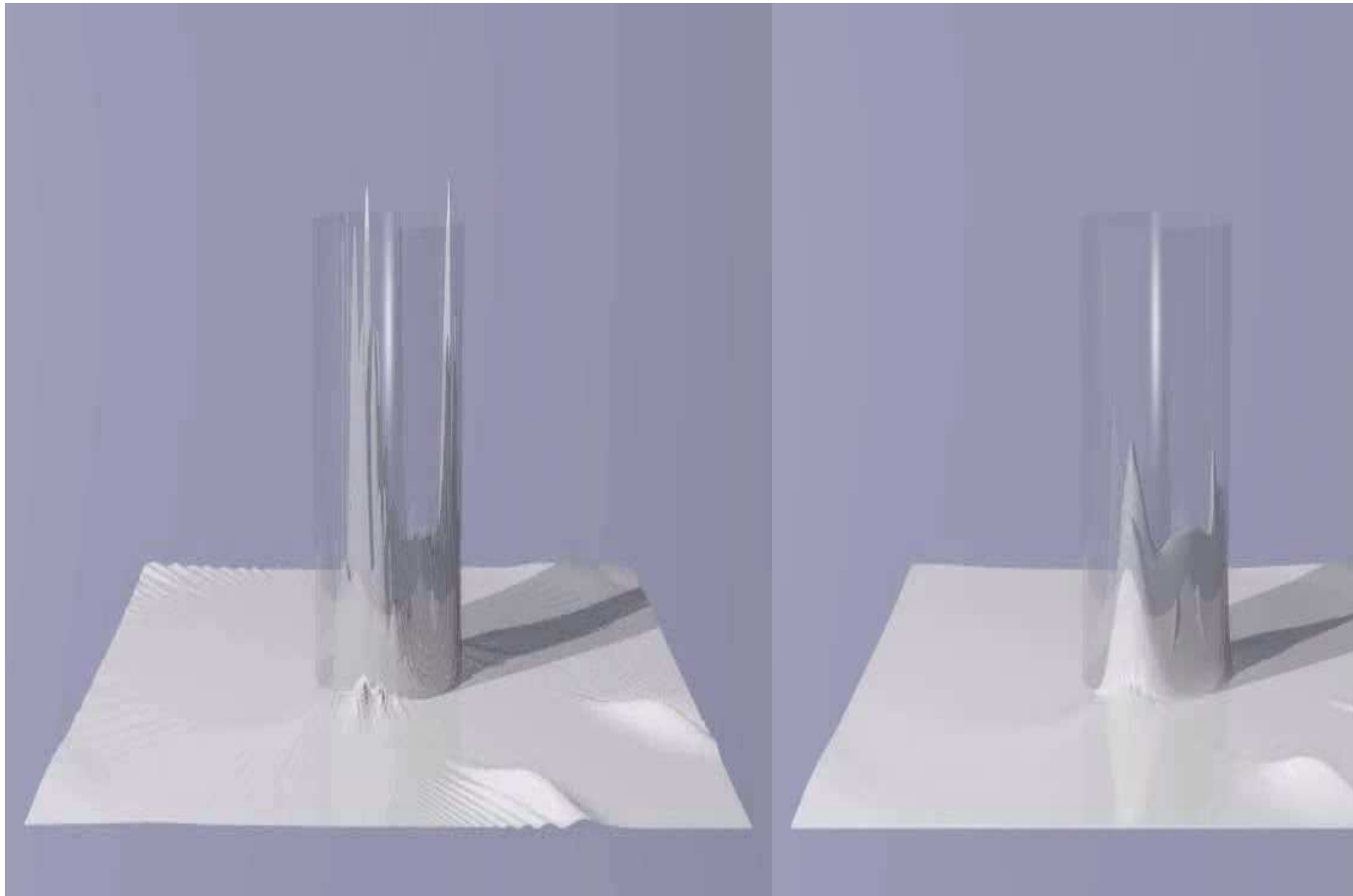
$$p(t + \Delta t) = \begin{pmatrix} p(t) & \text{with probability } T \\ -\alpha_- \mathfrak{N} + \beta_+ \mathfrak{T} & \text{with probability } R \end{pmatrix}$$

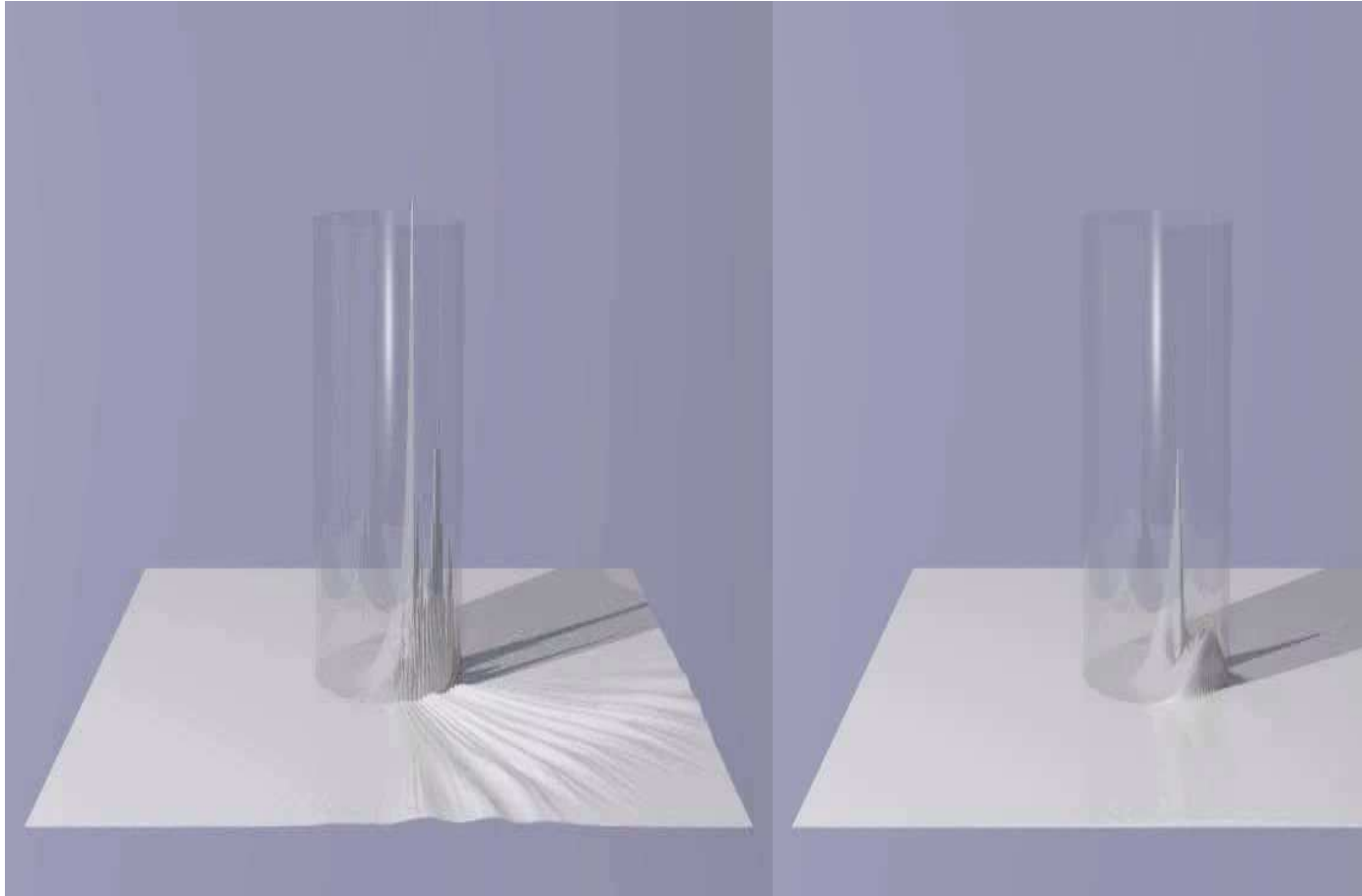
$T, R, \beta_+$  depend on  $\alpha_-, \beta_-!$

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# Example: Semiclassical ballistic scattering at a 'semiclassical' glass







## Conclusions 26

- ▶ Tools for simulation of charged particle transport in solids.
- ▶ Applicability to 2G - 4G solar cells.
  - Vastly different time scales (collisions vs. generation)
  - Barriers
- ▶ Many body problems beyond mean fields using particle based methods and  $P^3M$  and FMM approaches.
- ▶ Stochasticity due to random (unintentional) dopants .