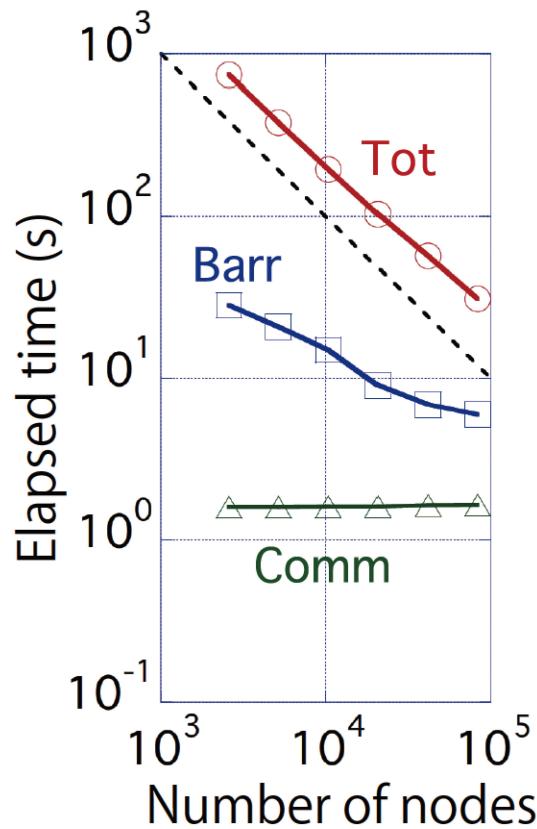


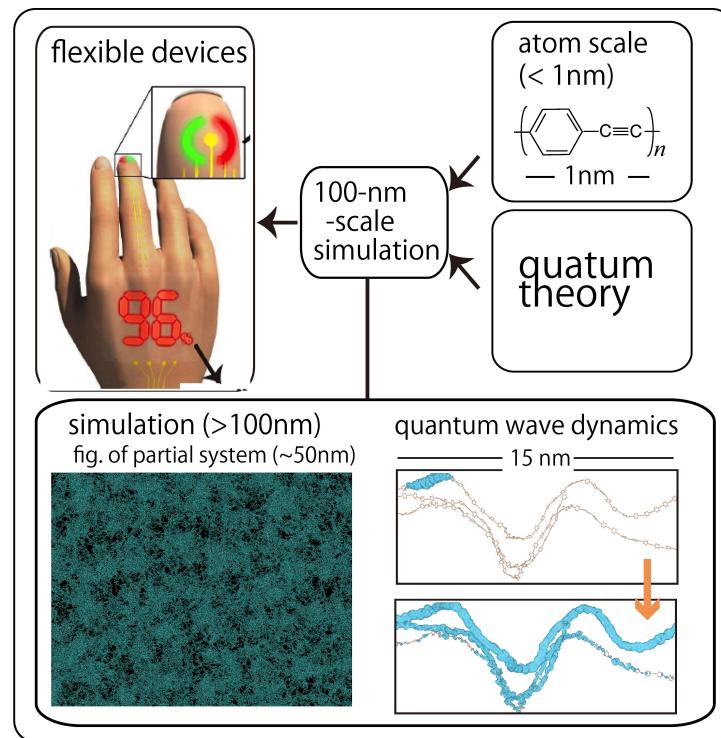
100nmスケール有機デバイス材料研究と数理

星健夫, 井町宏人, 梶貴美, 安部友樹也, 大平健太郎, 福本智哉(鳥取大)

1. アルゴリズム



2. アプリケーション



3. 現在進行形の話

- (a) 光電子デバイス
- (b) 機械学習との融合

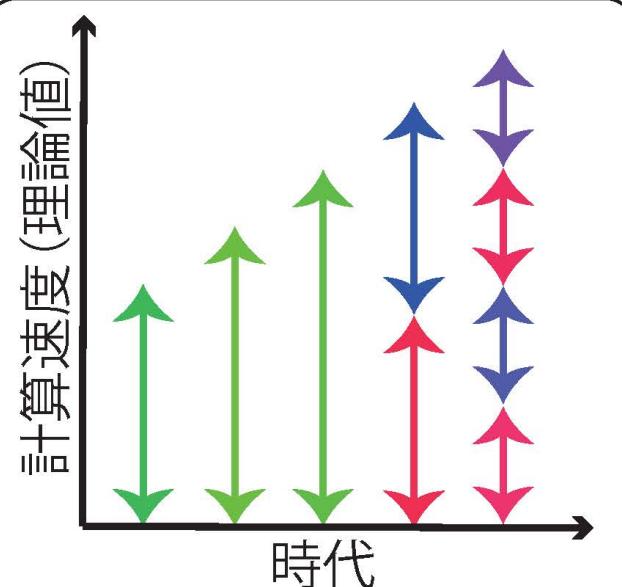
1+2: T. Hoshi et al., in press;
<http://arxiv.org/abs/1609.08377>

共同研究(有機材料):多田朋史(東工大)・石田雅也(住友化学)

共同研究(コードチューニング):南一生など(理研計算科学研究機構)

背景:並列計算へのパラダイムチェンジ(2000年代後半~)

並列計算機の登場



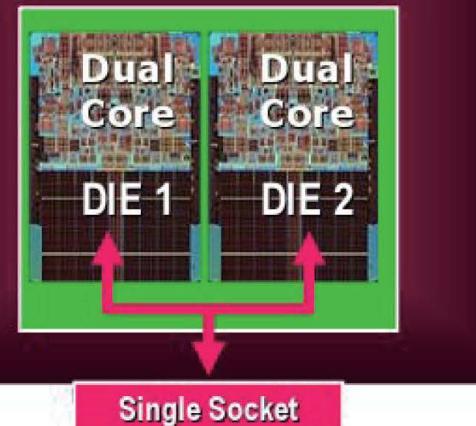
→「手分け」して計算する設計
→計算手法にパラダイムチェンジを迫ることに

Herb Sutter

"The Free Lunch Is Over",
Dr. Dobb's Journal, 30(3), March (2005)

→物質科学と数理・情報科学の共同研究

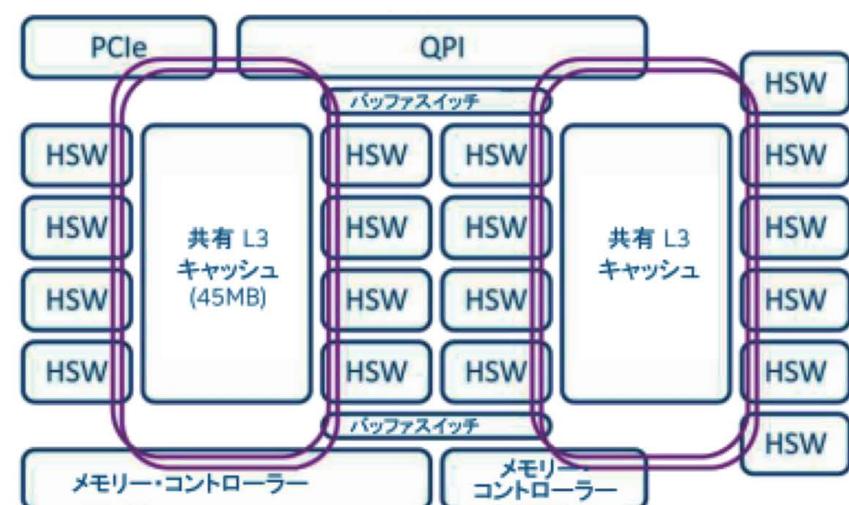
1st quad-core processor



インテル社のCPU

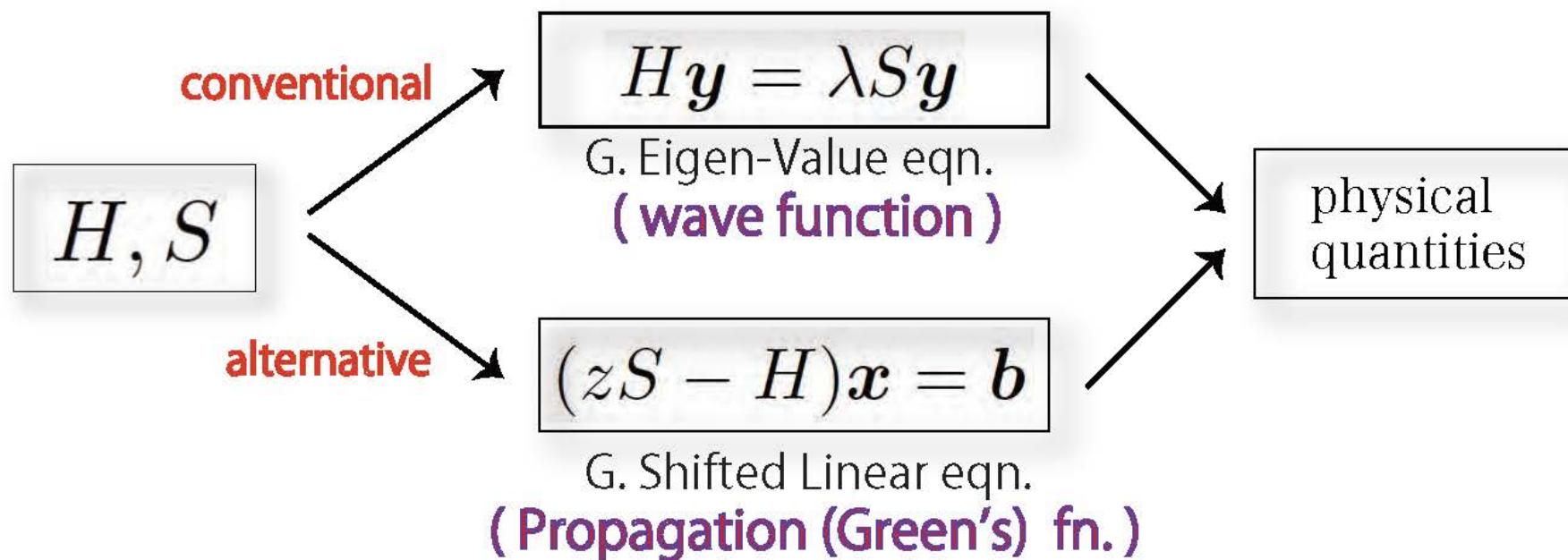
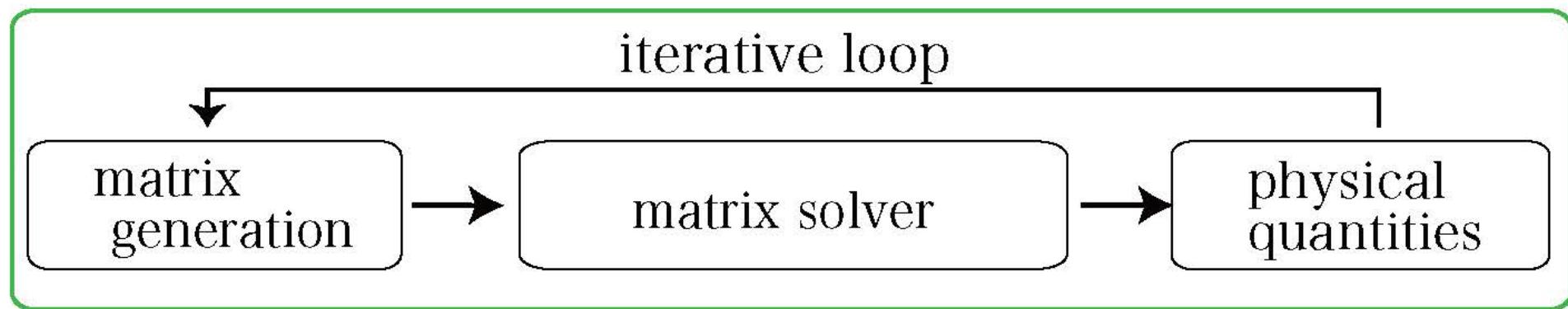
←Core 2 Quad(2006)

18-core Xeon (*)
(E5-2600-v3) (2014)→



Ground algorithm design

Workflow of electronic structure calculations



Basic equations

Generalized eigen-value (GEV) equation

$$H\mathbf{y}_k = \varepsilon_k S\mathbf{y}_k$$

wavefunction
formulation

H, S : Hermitian, S : positive definite ($S \doteq I$)

$$G = \sum_k \frac{\mathbf{y}_k \mathbf{y}_k^T}{z - \varepsilon_k}$$

Generalized shifted linear (GSL) equations

$$(zS - H)\mathbf{x} = \mathbf{b} \quad (z: \text{complex energy})$$

non-Hermitian

the propagation
(Green's) function
formulation

$$\rightarrow \mathbf{x} = G\mathbf{b}$$

with $G \equiv (zS - H)^{-1}$: the Green's function

Highly parallelizable mathematical structure

A pioneering work : W. Kohn, Phys. Rev. Lett. (1996) (W. Kohn won the Nobel Prize at 1998.)

Generalized eigen-value problem

$$H \mathbf{y}_k = \lambda_k S \mathbf{y}_k \quad (1)$$

Physical quantity with a given matrix X

(Ex. the case of $X = H$
--> Electronic structure energy)

$$\langle X \rangle \equiv \sum_k f(\lambda_k) \mathbf{y}_k^t X \mathbf{y}_k \quad (2)$$

with a given weight function
('Fermi distribution function')

$$f(\lambda) \equiv \frac{1}{\exp(\beta(\lambda - \mu)) + 1} \quad (3)$$

(β, μ : given parameters)

Physical quantity in trace form

$$\langle X \rangle = \text{Tr}[X \rho] \quad (4)$$

with the density matrix

$$\rho \equiv \sum_k f(\lambda_k) \mathbf{y}_k \mathbf{y}_k^t \quad (5)$$

Decomposition of the trace form

$$\text{Tr}[\rho X] = \sum_j \mathbf{e}_j^t \rho X \mathbf{e}_j \quad (6)$$

**'projected physical quantity'
calculated in parallelism**

with \mathbf{e}_j (j-th unit vector)

$$\mathbf{e}_j \equiv (0, \dots, 0, 1_j, 0, \dots, 0)^t \quad (7)$$

Highly parallelizable mathematical structure

The trace decomposition

$$\text{Tr}[\rho X] = \sum_j \mathbf{e}_j^T \rho X \mathbf{e}_j \quad (6)$$

gives the generalized shifted linear (GSL) equations
for calculation of projected physical quantities (PPQ).

GSL eqns.

$$(zB - A)\mathbf{x}^{(1)} = \mathbf{e}_1$$

$$(zB - A)\mathbf{x}^{(2)} = \mathbf{e}_2$$

$$(zB - A)\mathbf{x}^{(3)} = \mathbf{e}_3$$

PPQ

$$\mathbf{e}_1^T \rho X \mathbf{e}_1$$

$$\mathbf{e}_2^T \rho X \mathbf{e}_2$$

$$\mathbf{e}_3^T \rho X \mathbf{e}_3$$

:

:

$$\langle X \rangle = \text{Tr}[\rho X]$$

Highly parallelizable mathematical structure

Simplified explanation

- decomposition of the trace form
- calculation of trace elements
as parallel computation

$$\text{Tr}[A] = A_{11} + A_{22} + \dots + A_{MM}$$



parallel computation

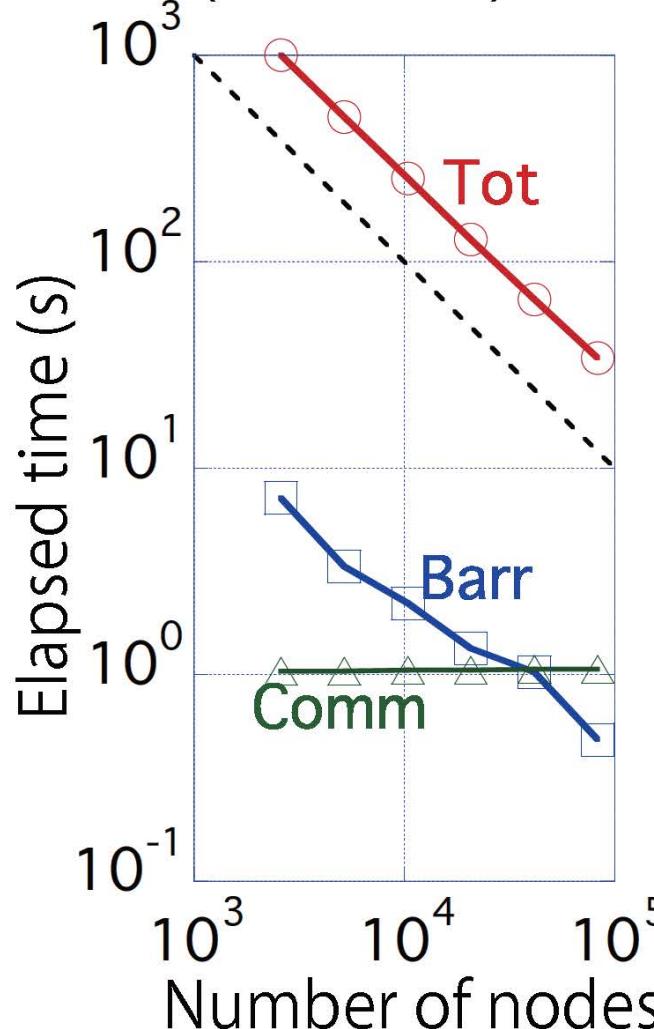
Parallel efficiency (strong scaling) on the full system of the K computer

100-nm-scale or 10^8 atoms calculations

parallel efficiency ratio α is determined with the reference data with 2,592 nodes.

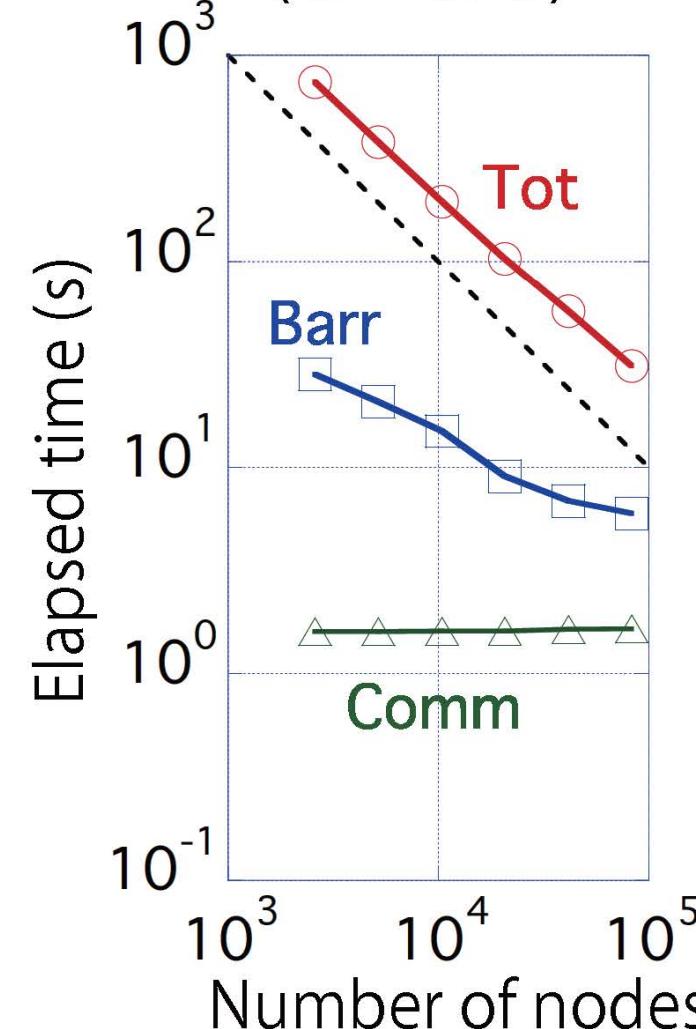
(a) ideal diamond crystal

$$(\alpha = 0.92)$$



(b) condensed polymer

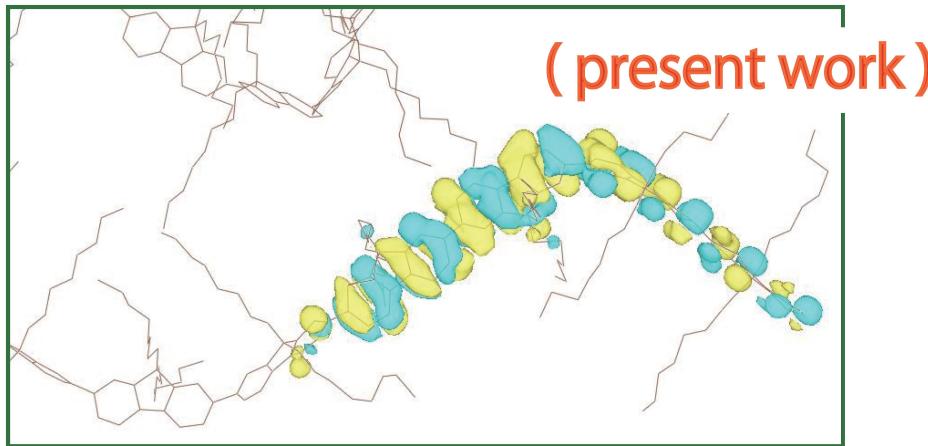
$$(\alpha = 0.75)$$



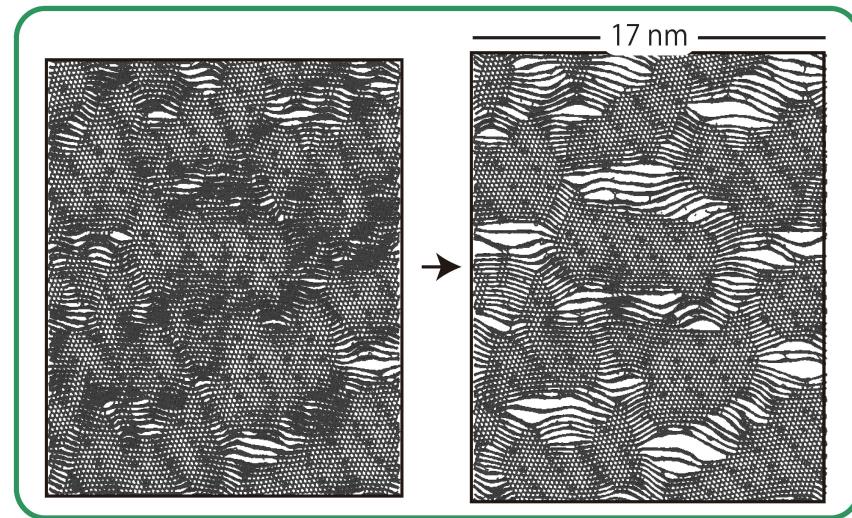
Tot : total elapsed time
Barr: barrier time
Comm: MPI communication time

Applications with ELSES (<http://www.elses.jp>), our software

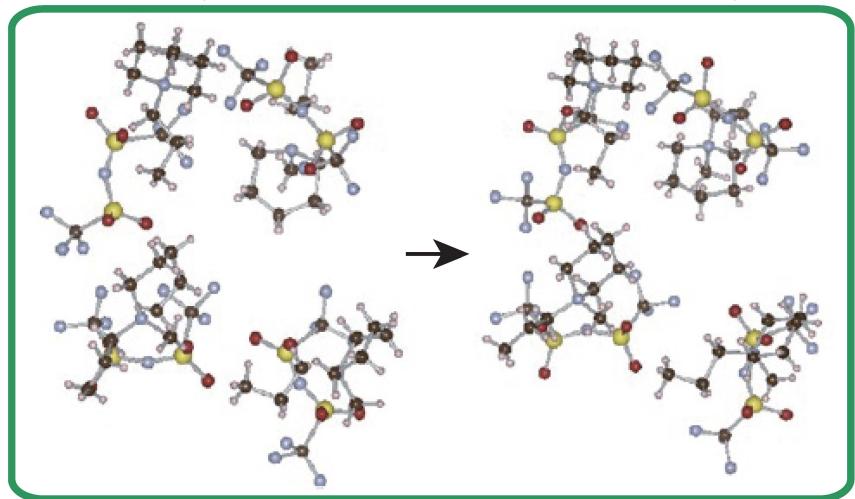
Organic device materials
(with Sumitomo Chemical Co.)



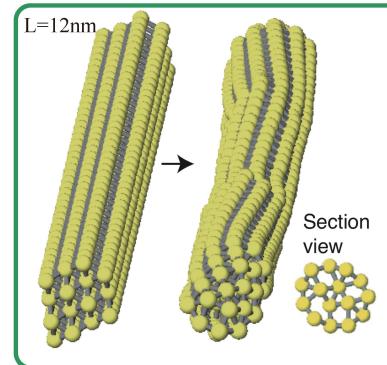
Ultra-hard diamond



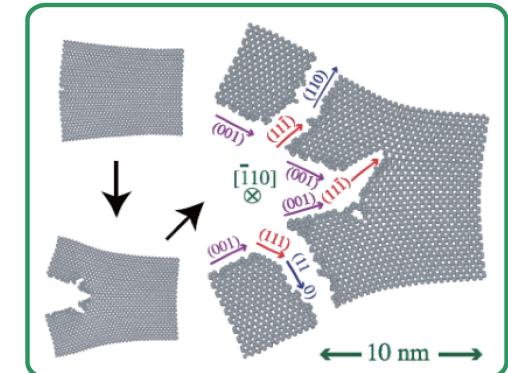
Battery material (with Toyota)



helical metal nanowire



silicon fracture



Detailed method:

Modelled (transferable tight-binding) theory based on first-principles calculations

The algorithmic strategy of the use of the shifted linear eqns is general and was applied to many scientific areas with large computation, for example ..

$$(zI - A)\mathbf{x} = \mathbf{b}$$

[1] (**QCD**) A. Frommer, Computing 70, 87 (2003)

[2] (**large scale electronic structurre calc.**)

R. Takayama, T. Hoshi, T. Sogabe, S.-L. Zhang, and T. Fujiwara, PRB 73, 165108 (2006)

[3] (**many-body wavefunction theory**)

S. Yamamoto, T. Sogabe, T. Hoshi, S.-L. Zhang and T. Fujiwara, JPSJ 77, 114713 (2008).

→ General numerical routine: 'K ω ' <https://github.com/issp-center-dev/Komega/> (2016)
with Yoshimi, Kawamura, Yamaji (U Tokyo), Sogabe (Nagoya U) et al.

ex. the use with the many-body calculation code 'HΦ' (Yamaji et al.)

[4] (**ab initio transport calculation**)

S. Iwase, T. Hoshi, T. Ono, Phys. Rev. E 91, 06330 (2015).

[5] (**GW calculation**)

F. Giustino, M. L. Cohen, S. G. Louie, Phys. Rev. B. 81, 115105 (2010)

[6] (**nuclear physics**)

T. Mizusaki, K Kaneko, M. Honma, T. Sakurai, Phys. Rev.C 82, 024310 (2010)

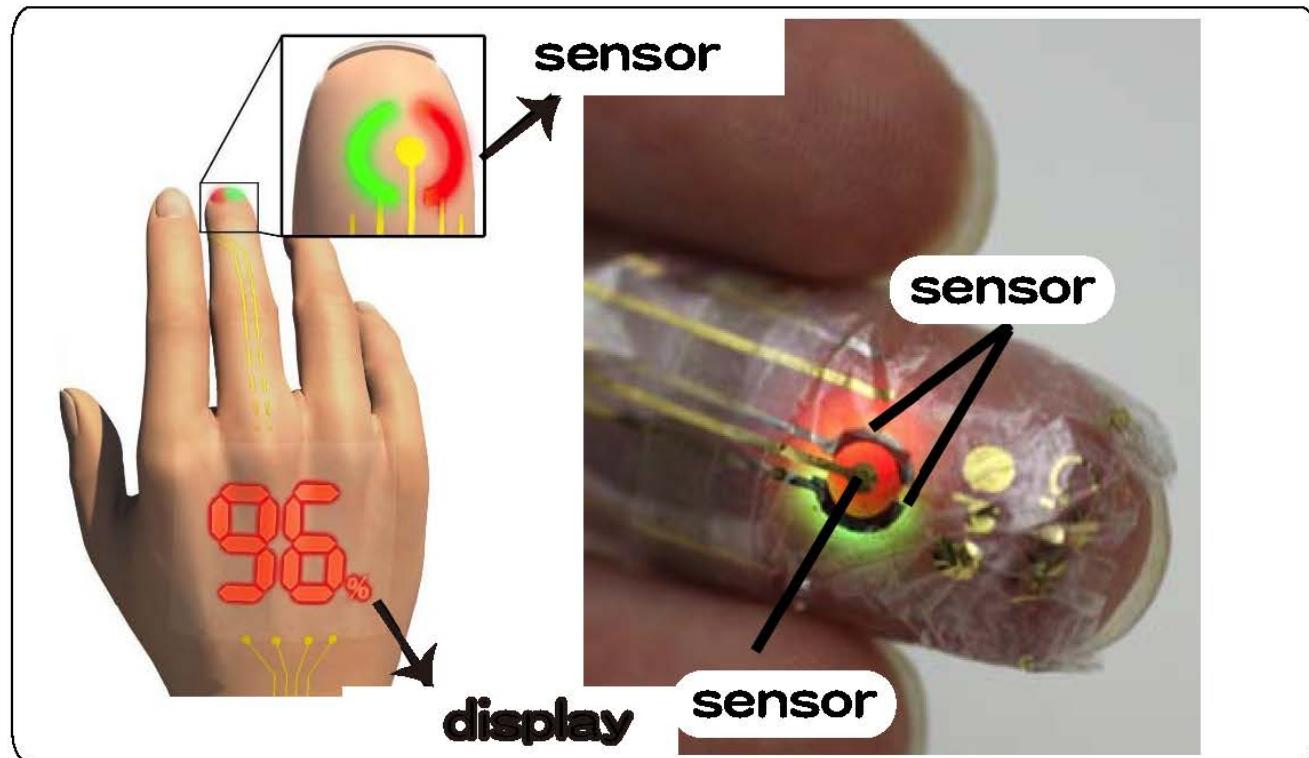
Introduction : organic material for ultra-flexible devices

Organic material gives the foundation of ultra-flexible (wearable) devices of Internet-of-Things (IoT) products, like display, and sensor
(thickness $\leq 1,000$ nm)

Ex. 'Rollable' (ultra-flexible)
display,
Sony, News Release,
26. May. (2010)



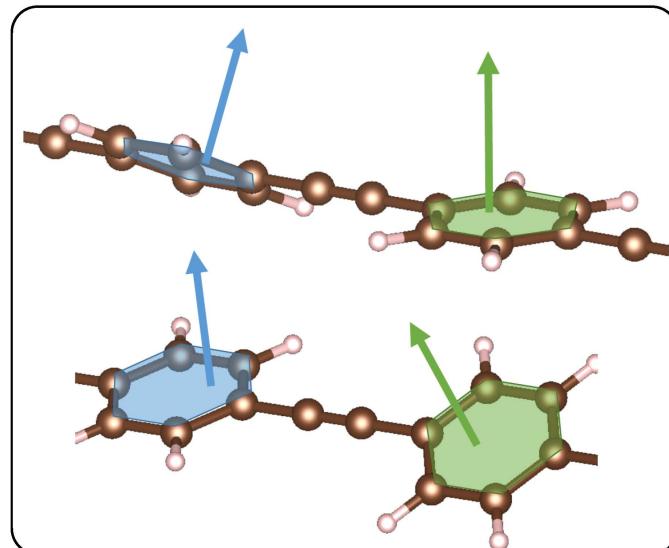
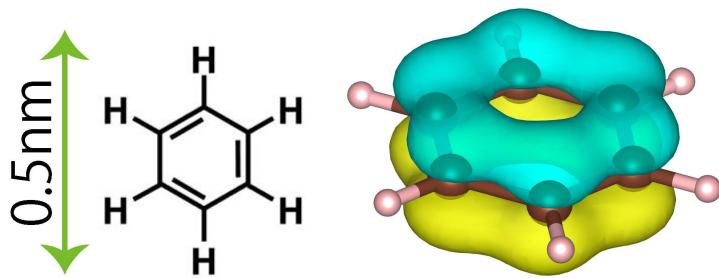
Ex. 'e-skin' (U Tokyo)
T. Yokota, et al.,
Sci. Adv. 2, e1501856 (2016)
(wearable device
monitoring your health)



Organic device material and 100-nm-scale quantum simulation

Organic device material

- semiconductor with ' π -type' electronic wave that lies in benzene rings and so on
→ strong anisotropy



Pioneering experimental research in 1970's

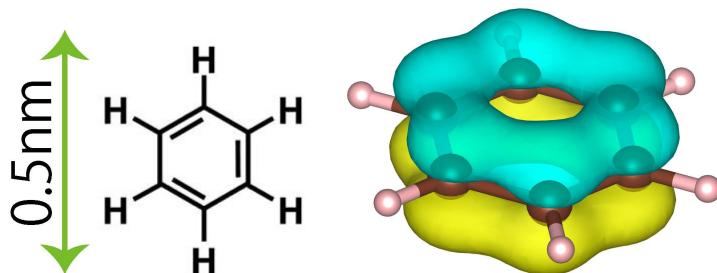
↓
The Nobel Prize in Chemistry 2000:
'discovery and development
of conductive polymers'
A. Heeger, A. G. MacDiarmid, H. Shirakawa



Organic device material and 100-nm-scale quantum simulation

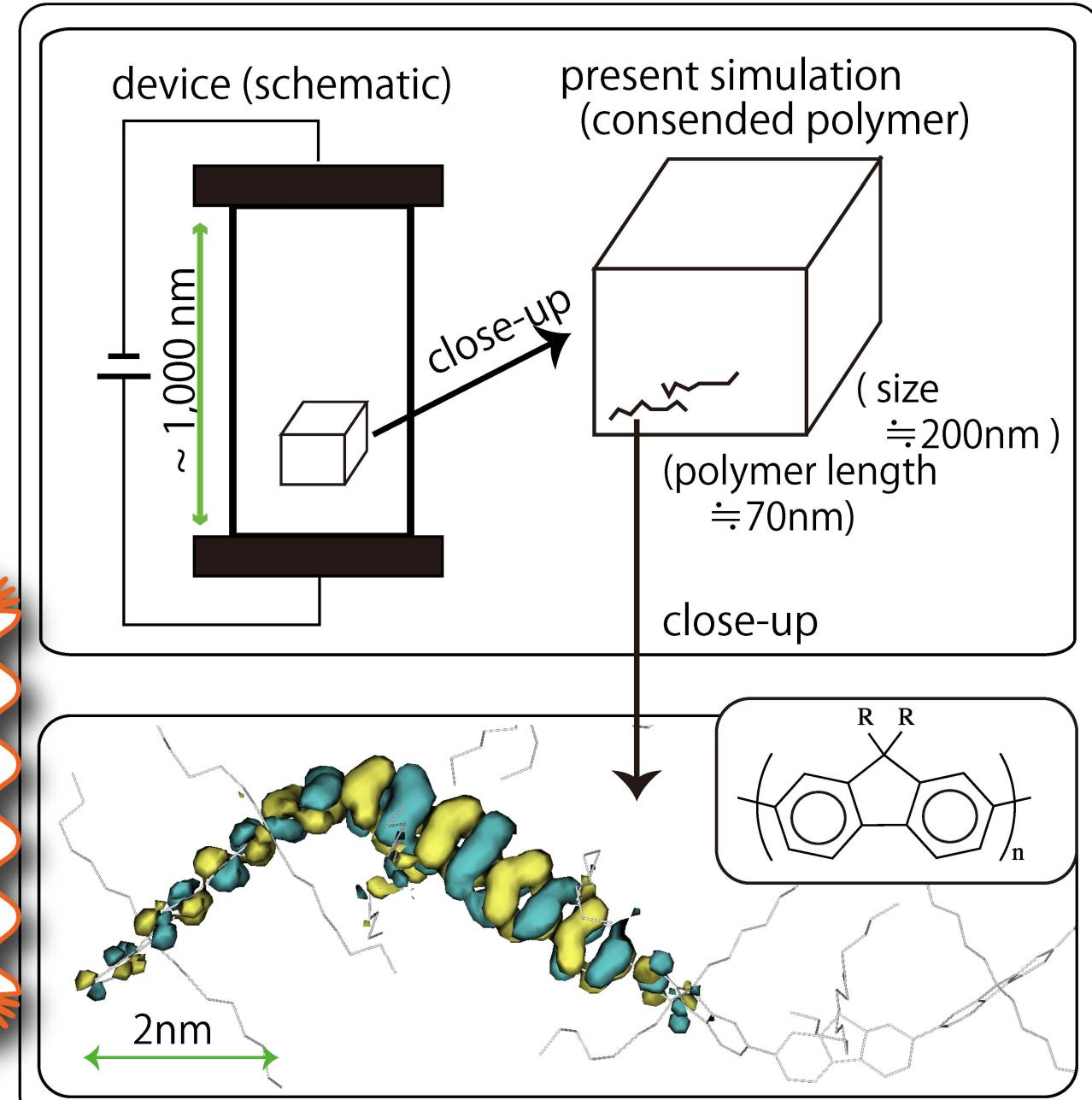
Organic device material

- semiconductor with ' π -type' electronic wave that lies in benzene rings and so on
→ strong anisotropy



Industrial materials are disordered system in 100-nm-scale or with 100-million-atoms

Scales between device and 100-nm-scale simulation



Quantum (wavepacket) dynamics for device simulation

Non-equilibrium, non-stationary simulation

Solving an effective Schrodinger-type equation (details are not yet settled)

$$i \frac{\partial \psi}{\partial t} = H\psi \quad (1)$$

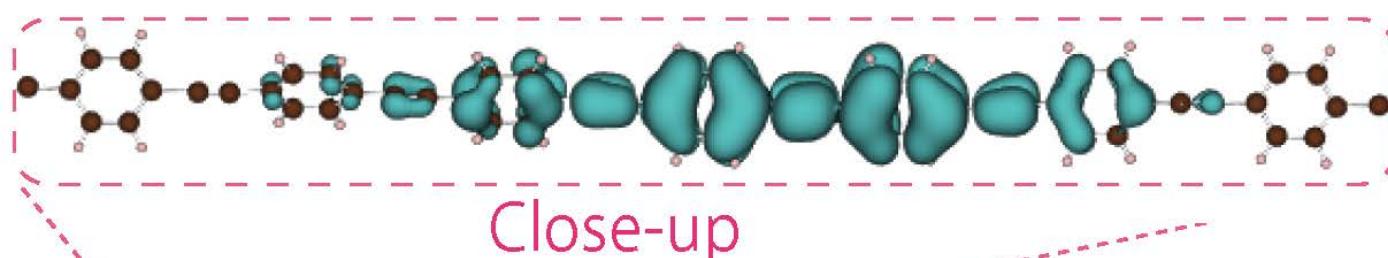
$$\psi \equiv \psi(\mathbf{r}, t) \quad (2)$$

: electronic 'wave'
(ex. hole wave packet)

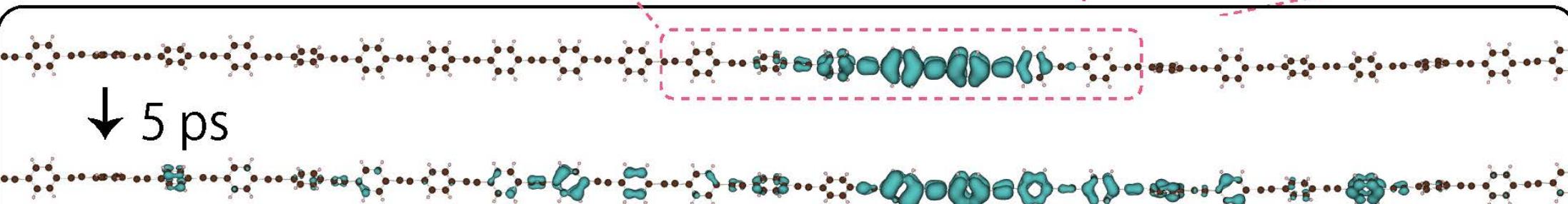
$$\rho(\mathbf{r}, t) \equiv |\psi(\mathbf{r}, t)|^2 \quad (3)$$

: charge distribution (real value)
→ calculation of
device performance
or 'mobility' value

Example of a partial region
of a polymer;



↓ 5 ps

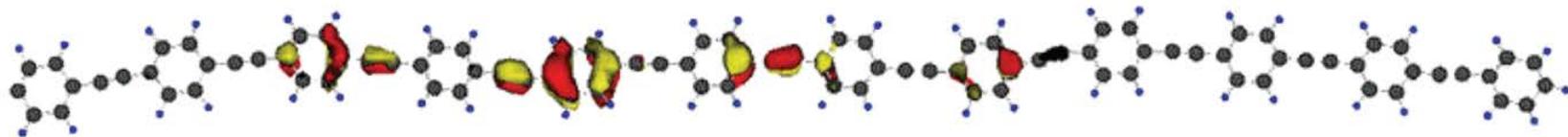


Example of wavepacket simulation

$$\partial_t \Psi = -iH\Psi$$

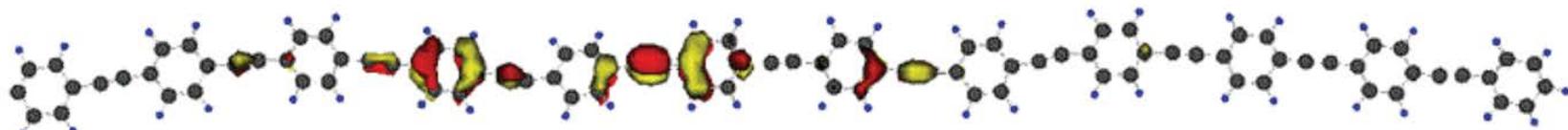
PiConjPoly-144atom-para quantum-dynamics,
step = 0.0
real

Real
 $\text{Re}[\Psi]$



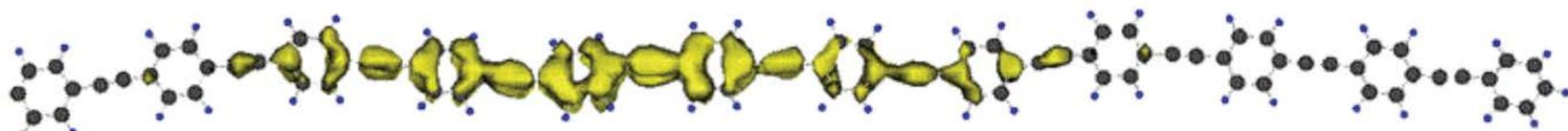
imaginary

Imag
 $\text{Im}[\Psi]$



charge

norm
(charge)
 $|\Psi|^2$

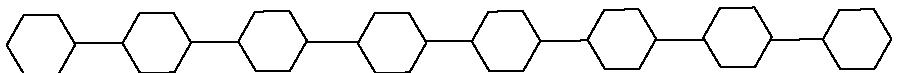


Comparizon between linear and zigzag chain structures

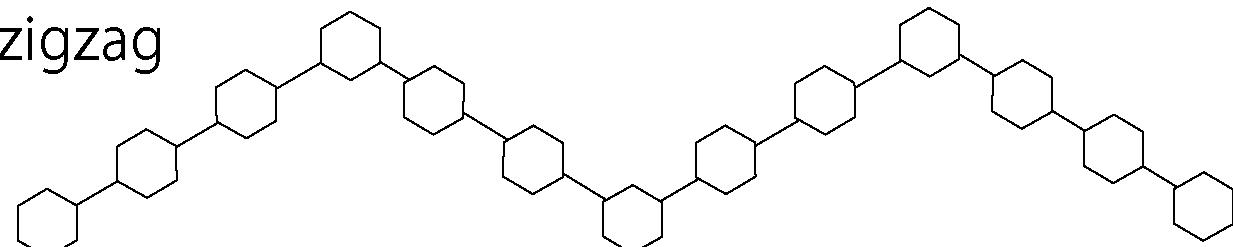
poly(phenylene–ethynylene) ([1] J. Terao, et al, Nature Comm. 4, 1691 (2013))

→ The static and dynamical disorders
are essential for device performance (mobility value)

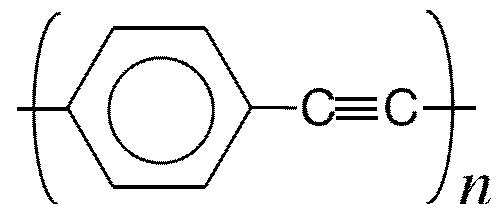
linear



zigzag



example (linear chain)



Result

mobility in ideal structure
(linear) > (zigzag)

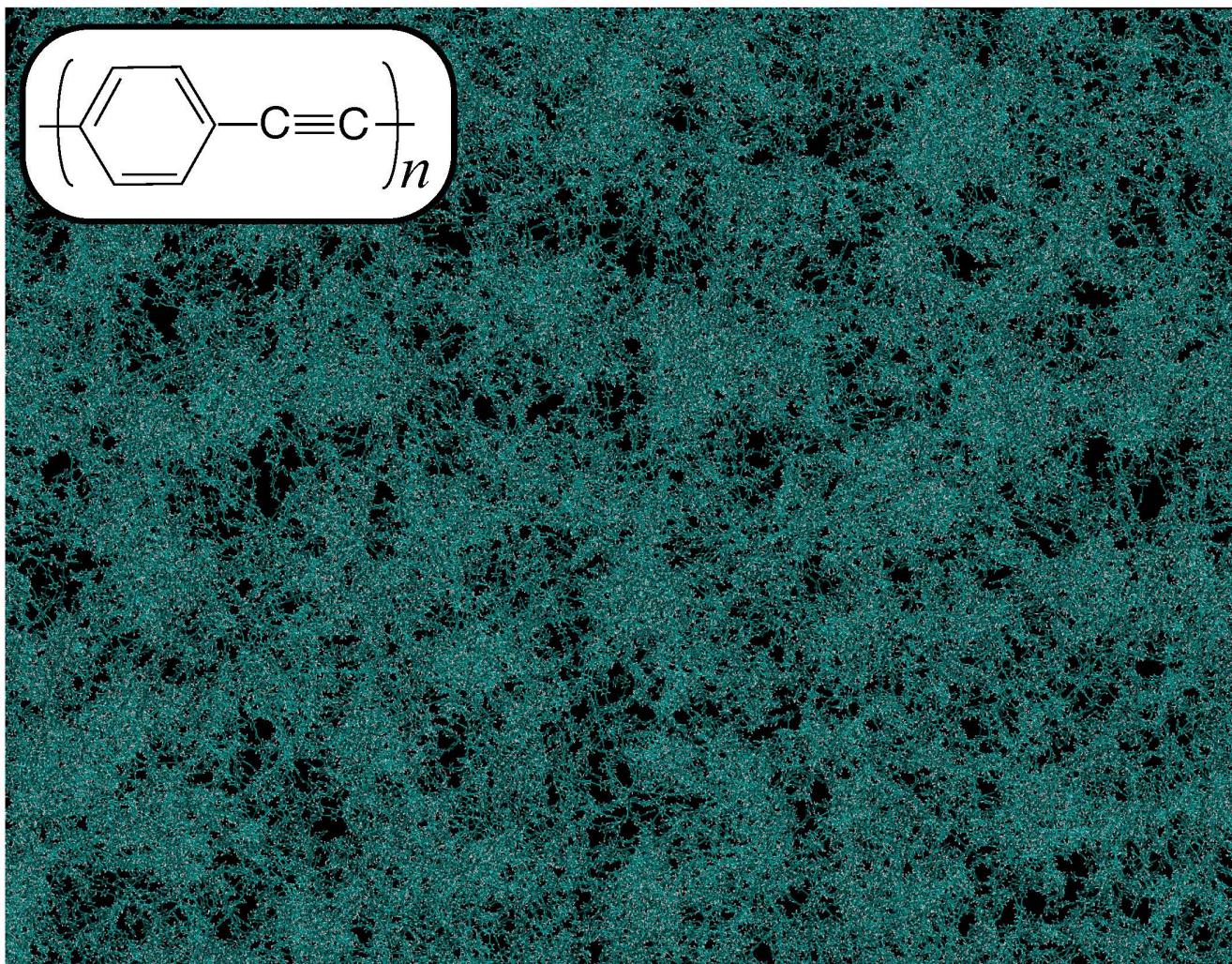
mobility in realistic (disordered) structure
(linear) < (zigzag)

100-million-atom caulation of condensed organic polymers

Investigation on wave propagation mechanism (for device property)

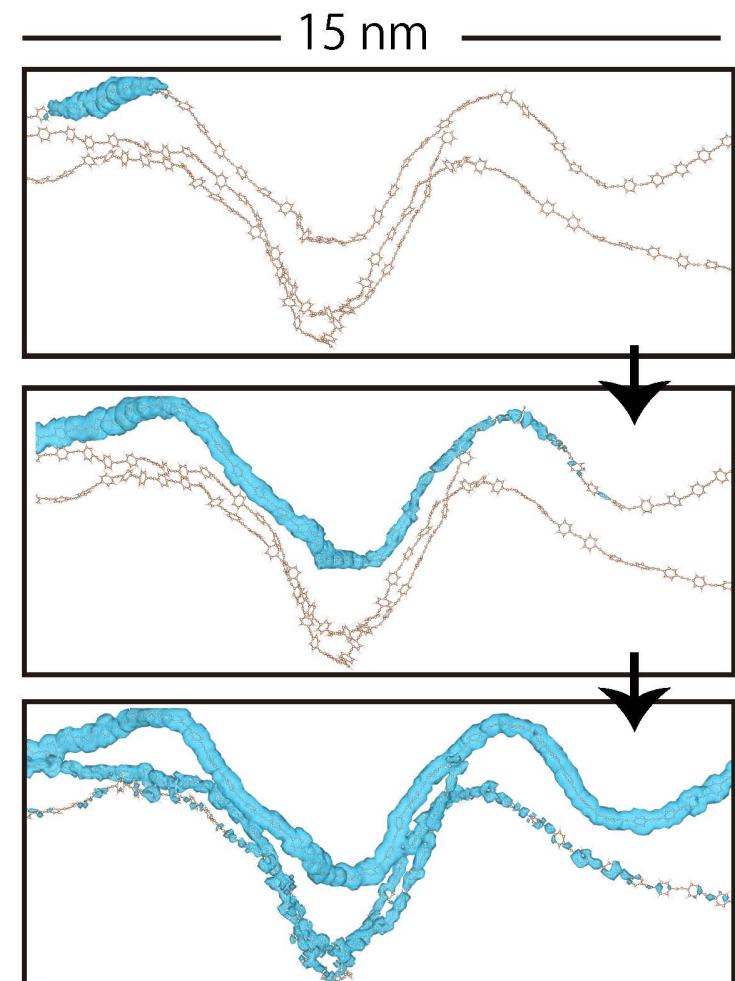
(a) material: poly-(phenylene-ethynylene) (PPE)
(size \approx 200nm, P=100,000 polymers)

Figure of a partial retion (~50nm)



(b) Quantum dynamics

Fig: Charge dynamics with 1 ps

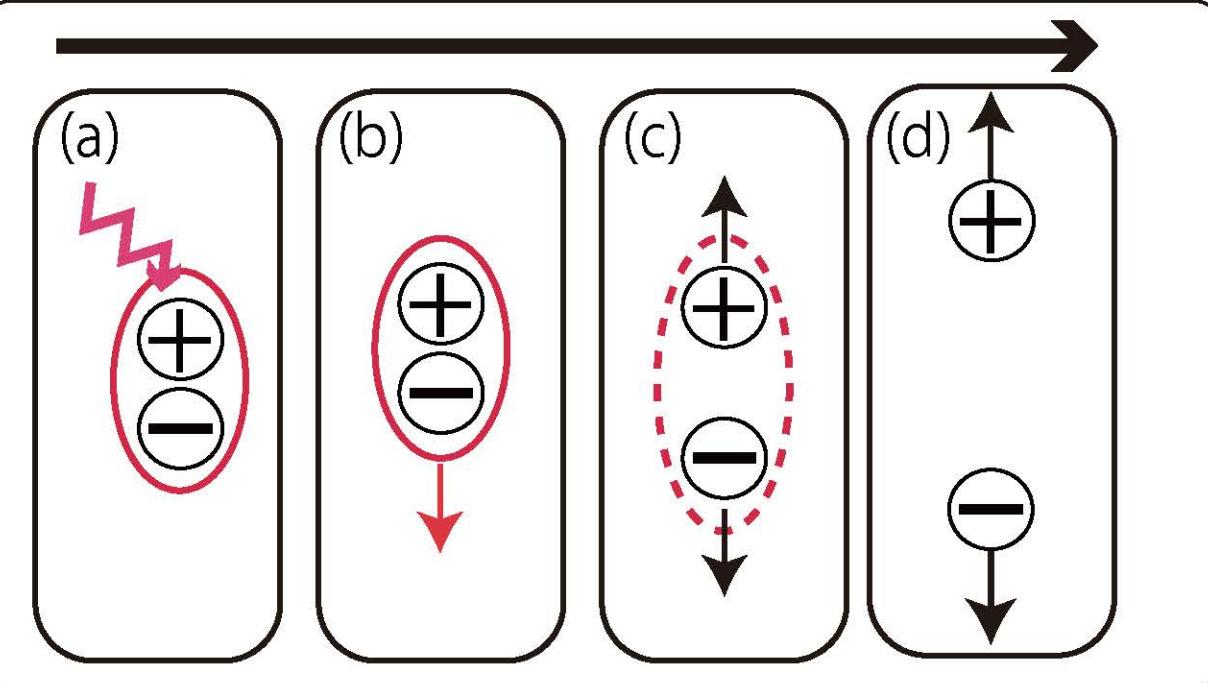


Opt-electronics device simulations

with T. Fujita (IMS) and Y. Mochizuki (Rikkyo U)

Four elementary processes

- (a) Creation of exiton (electron-hole pair) by light absorption
- (b) Exciton dynamics (diffusion)
- (c) Dissociation of exiton into carriers (hole and electron)
- (d) Diffusion of carriers



Two types of device

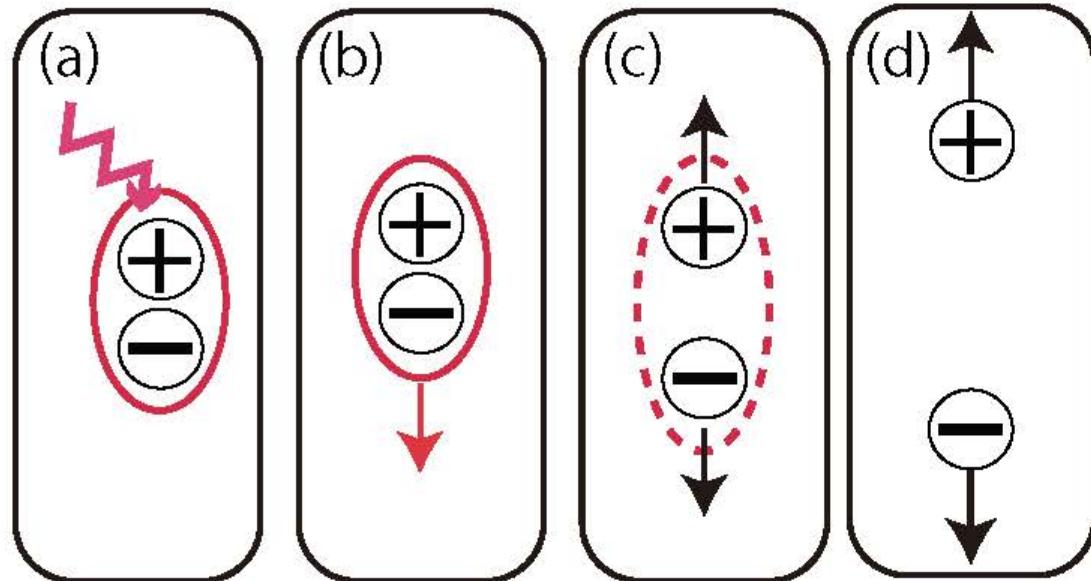
- (i) sensor type
(light \rightarrow current),
- (ii) display type
(current \rightarrow light)

Opt-electronics device simulations

with T. Fujita (IMS) and Y. Mochizuki (Rikkyo U)

Four elementary processes

- (a) Creation of exciton (electron-hole pair) by light absorption
- (b) Exciton dynamics (diffusion)
- (c) Dissociation of exciton into carriers (hole and electron)
- (d) Diffusion of carriers



(b) Two-body wave dynamics

$$\dot{\mathbf{u}} = -iH\mathbf{u}$$

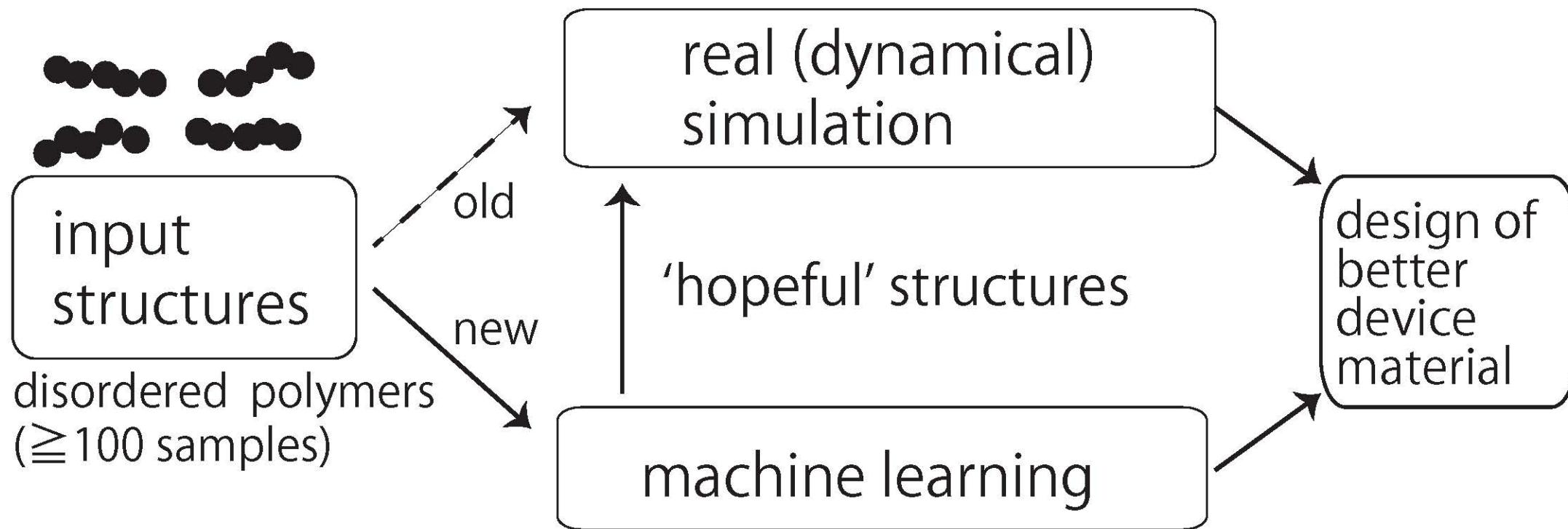
(matrix size) $\propto (\# \text{ atom})^2$

(d) One-body wave dynamics
(in previous section)

(matrix size) $\propto (\# \text{ atom})$

Machine learning analysis on organic polymers (1/2)

with Weichung Wang's group (National Taiwan U)



Machine learning analysis on organic polymers (2/2)

with Weichung Wang's group (National Taiwan U)

200 samples of disordered polymers

→ classification for higher or lower device performance (mobility value)

samples
(200 structures)

↓ Eigen value analysis

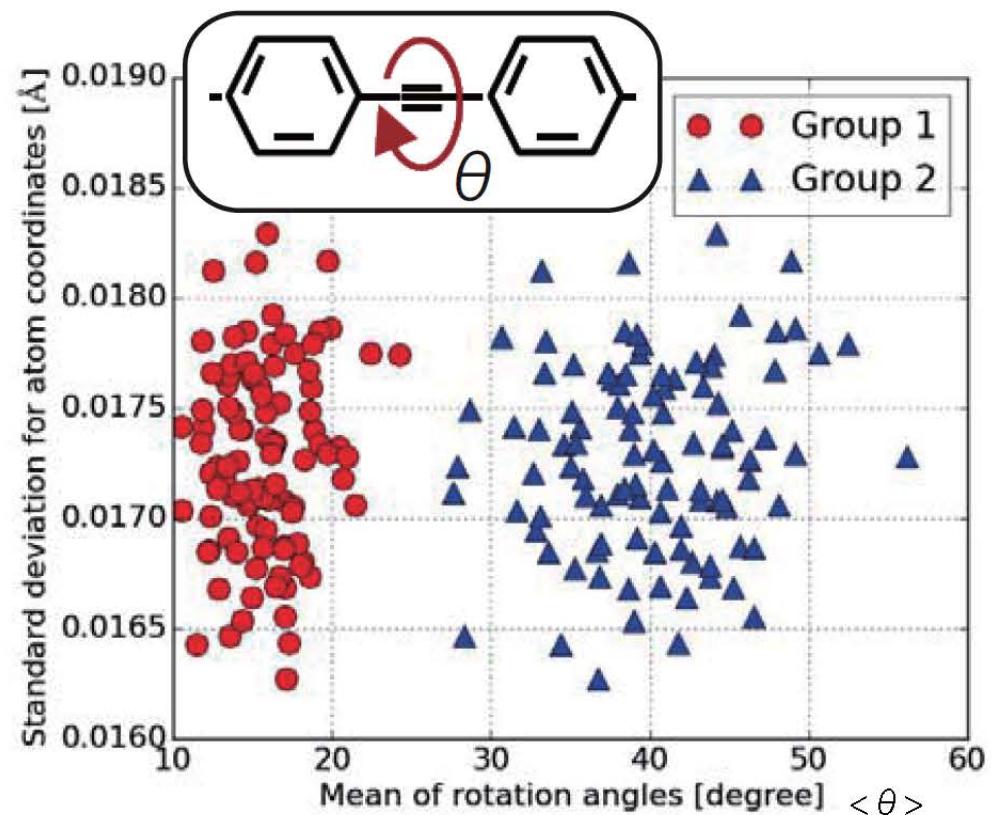
Participation Ratio
diagram

↓ Use as descriptor

Machine learning

(k-means clustering method)

Classification of 200 samples into two groups successfully



本発表のまとめ:有機デバイス材料の量子シミュレーション

1. アルゴリズム

→応用・数理系研究者で、問題・コードの共有

2. アプリケーション

3. 現在進行形の話(*)

- 光電子デバイス、機械学習の融合

行列方程式

$$A\mathbf{y} = \lambda B\mathbf{y}$$

$$(zB - A)\mathbf{x} = \mathbf{b}$$

$$\dot{\mathbf{u}} = -iH\mathbf{u}$$

(*) 12/6-7, ポスト「京」重点課題7研究会(東大物性研)等で発表

大局的なまとめ

1. ニーズ志向型解法

- 俯瞰的視点: 物理理論→計算系(行列など)→数値計算→応用
(例: 本講演での高分子集合体→「ほぼ」ブロック対角行列)
- 数理構造がガイドライン

2. 大規模シミュレーションと機械学習の融合

- コードレベルの融合: すべてをスパコン上でオンライン処理
大規模シミュレーション(big data生成)→記述子抽出→機械学習
- 精度可変型可変型数値計算: 新しい需要
「少数の高精度計算」 \Leftrightarrow 「多数の低精度計算」