

# Electronic coarse-graining of semiconductors: methodology and applications

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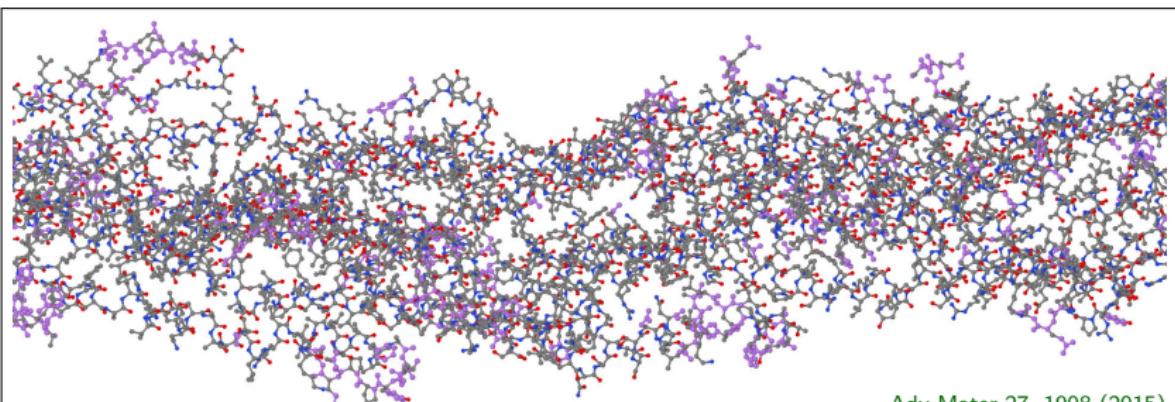


## Outline

- Introduction and illustrative examples
- Methodology
- Applications

## Electronic Coarse-Graining (ECG) in examples

- When do we need ECG? – When system is too complex for use of conventional electronic structure methods (e.g. polymers)
- What is the “price” for ECG? – Only frontier orbitals are calculated (enough for majority of electronic phenomena)
- ECG example 1/4: biopolymers (localized states  $\Rightarrow$  trivial ECG)

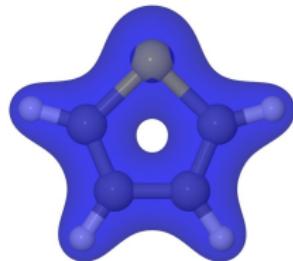


10k non-H atoms  $\Rightarrow$  50k valence molecular orbitals (MOs) or 1M AOs  
but frontier MOs are localized on a small fraction of AOs (violet color)

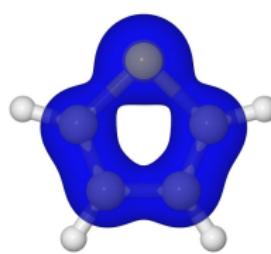
## ECG: more precise formulation

**ECG idea/goal:** Get minimal basis providing accurate description of a particular electronic property under molecular fluctuations  
(large-scale/low-energy electronic phenomena: UV-Vis spectra, transport)

**Output:** electronic basis + electronic Hamiltonian



All-electron density

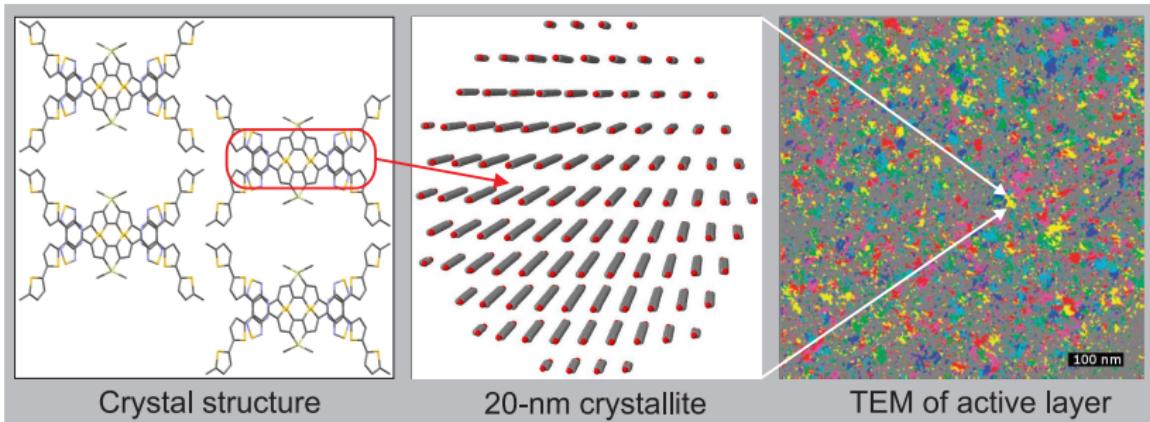


CG density (2 MOs)

### Requirements:

- Robustness of CG basis wrt molecular fluctuations
- Robustness and scalability of CG algorithm
- Quality control of CG basis and matrix elements
- Accurate extrapolation to infinite system (if needed)

## ECG example 2/4: electronic transport in a molecular solid



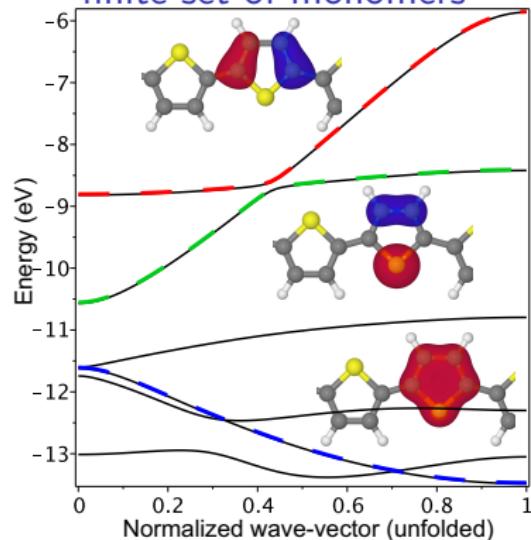
- Coarse grain electrons to **one site per molecule**
- Simplify molecular motions to harmonic vibrations
- Linearize coupling between electrons and molecular motions

$$\Rightarrow \sum_{ij} H_{ij}^{1p} c_i^\dagger c_j + \sum_{\alpha} \hbar \omega_{\alpha} \left( b_{\alpha}^\dagger b_{\alpha} + \frac{1}{2} \right) + \sum_{ij\alpha} \hbar \omega_{\alpha} g_{ij\alpha} \left( b_{\alpha}^\dagger + b_{\alpha} \right) c_i^\dagger c_j$$

Then solve this Hamiltonian (e.g. in small polaron hopping approximation)

# ECG in examples 3/4: less trivial coarse-graining

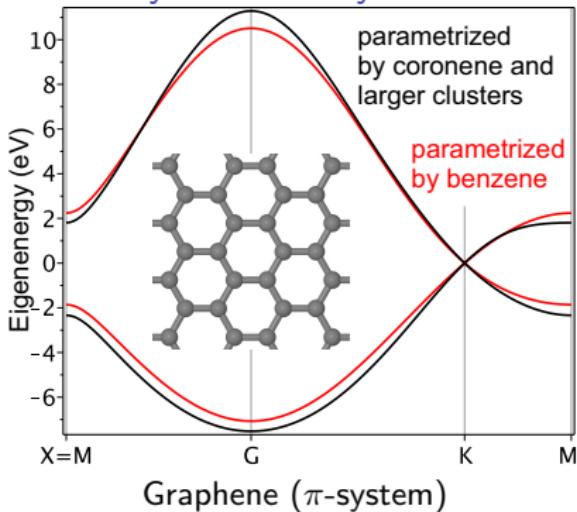
Combinatorial screening of polymers and oligomers from a finite set of monomers



Single polythiophene chain ( $\pi$ -system)

rational design – Chem Sci 8, 1146 (2017), Solar Energy 198, 605 (2020)

Electronic structure of infinite systems with methods available only for finite systems\*

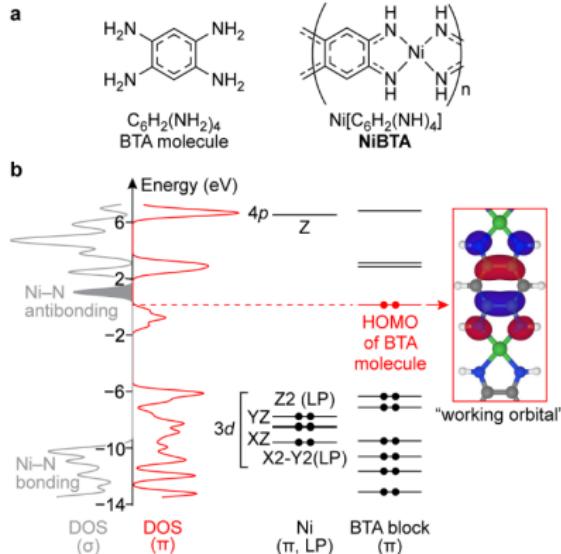


polarons in phosphorene – JPCL 12, 4674 (2021)

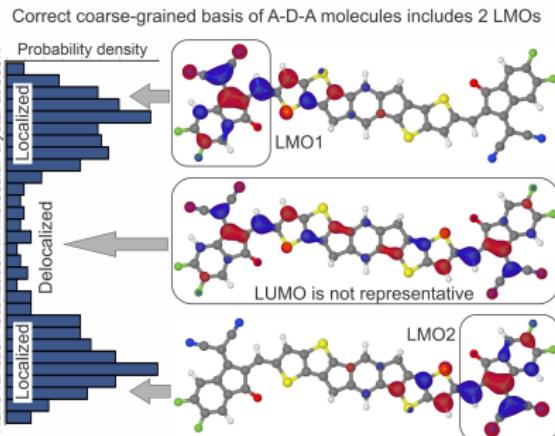
\*e.g. PBE-D3 is good for crystal structure but bad for e-properties JCTC 19, 8481 (2023)

# ECG in examples 4/4: nontrivial coarse-graining (and applications)

## Metal-organic systems



## Extended molecules



solar cells – JCP 159, 024107 (2023)

energy storage – Chem Sci 13, 8161 (2022)

... and other structurally complex systems

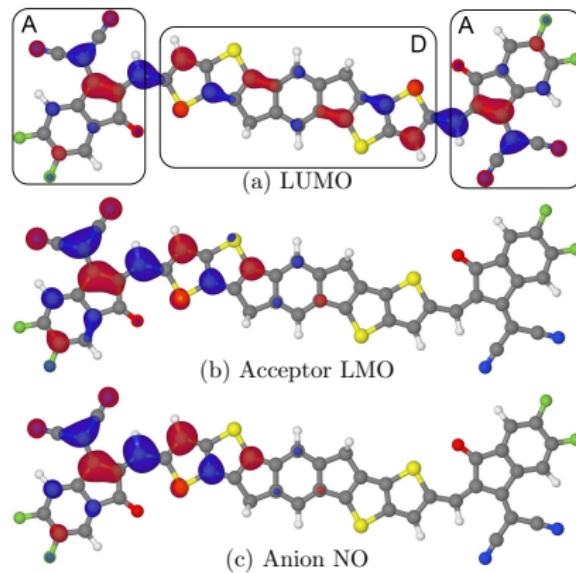
# Methodology of ECG

## Requirements:

- Robustness of CG basis wrt molecular fluctuations
  - Case study of A-D-A molecules (e.g. NFA for solar cells)
- Robustness and scalability of CG algorithm
  - Implementation
- Quality control of CG basis and matrix elements
- Accurate extrapolation to infinite system (if needed)
  - Efficient parametrization of tight-binding models

# Robustness of CG basis wrt molecular fluctuations:

Case study of A-D-A molecules (non-fullerene acceptors in solar cells) JCP 159, 024107 (2023)



Determine qualitative and quantitative errors of inaccurate ECG:

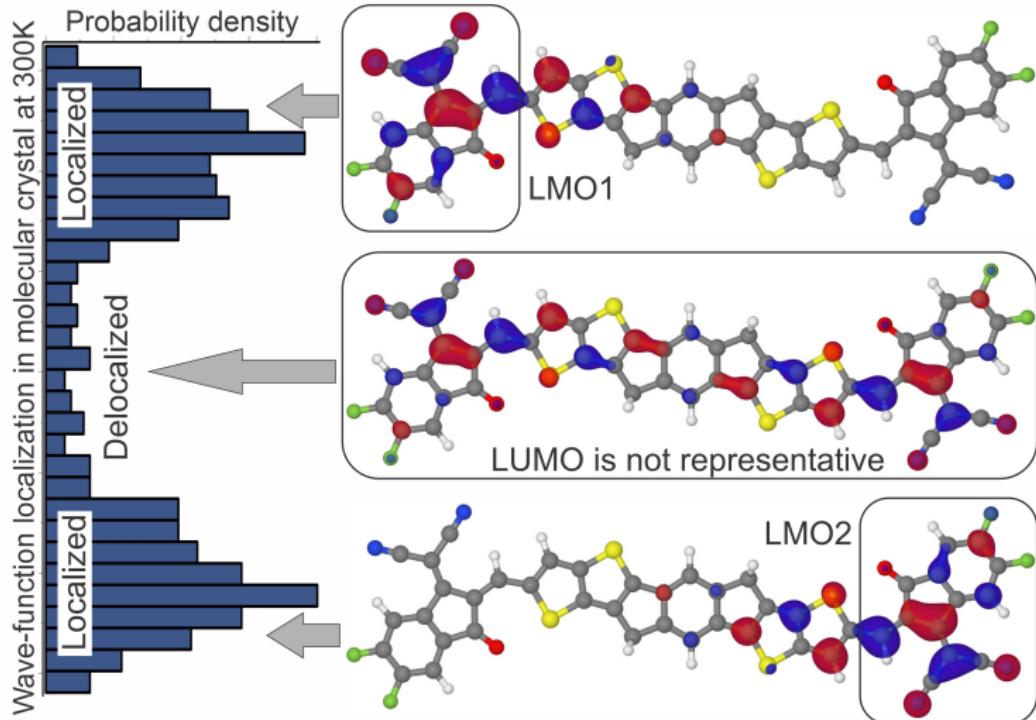
- Is electron localized on acceptor or delocalized over molecule?
- How inaccurate ECG influences charge transport parameters?
- To be compared: 1-site vs 2-site, 2-LUMO vs 2-LMO models

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MO=Molecular Orbital, LUMO=Lowest Unoccupied MO, LMO=Localized MO

# Main result

Correct coarse-grained basis of A-D-A molecules includes 2 LMOs

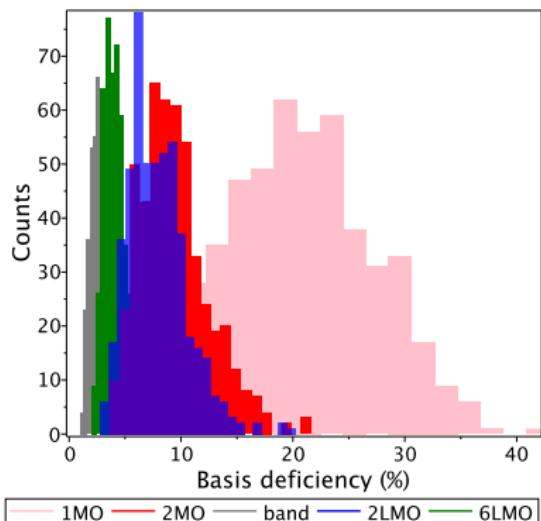


For molecular solids, the geometry is sampled by classical MD.

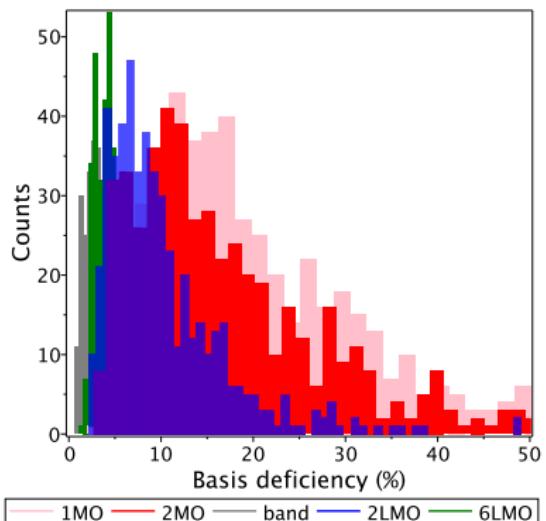
For molecules, quantum effects are considered by sampling thermal vibrations.

## More rigorously: 2-LMO model is the most appropriate

Statistical analysis of the basis deficiency in a coarse-grained description of electron MO and NO (i.e. LUMO and anion NO):



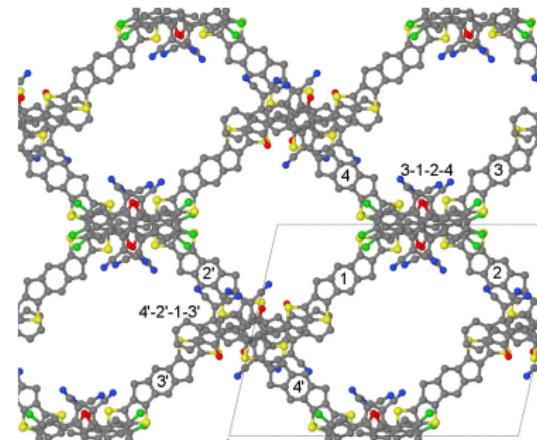
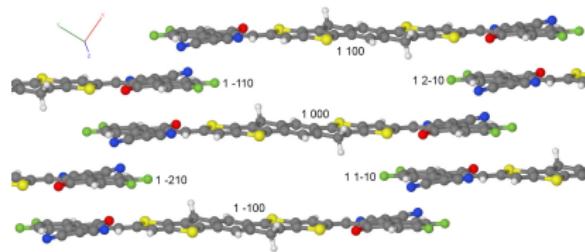
Electron NO in crystal  
⇒ 1-site model fails



Electron MO in amorphous solid  
⇒ 2-LUMO model fails

# How inaccurate ECG influences calculated mobility?

In a solid A-D-A molecules form 2 intermolecular contacts per A  
⇒ coordination number of electronic connectivity graphs is 3  
⇒ either honeycomb (2D) or K4/Laves (3D) lattices



*Analysis of effective masses and hopping amplitudes ( $\sim$ mobility) shows that the main effect is that 1-site model underestimates intermolecular couplings by factor of 2*

# Methodology of ECG

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  - Implementation
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# Robustness and scalability of ECG algorithm

## Algorithm

1. Determination of coarse-grained (CG) basis
2. Parametrization of tight-binding Hamiltonian
3. Quality control (for new systems)

ECG might often look trivial but here “the devil is in the details”, so there are many challenges in practical implementation:

- Large systems (large supercells)
- Entangled bands (overlapping in energy or hybridized)
- Cluster approximation to infinite systems
- Complex cases (e.g. excited states, no fixed SCF)
- Parametrization of complex models (e.g. electron-phonon)
- SCF and total energy in CG-basis

# Determination of coarse-grained (CG) basis

In what follows we consider coarse-graining of molecular orbitals (MOs)

## Algorithm

1. MOs of interest must be representable in CG basis  
     $\Rightarrow$  CG MOs are usually **localized MOs (LMOs)**
2. Tight binding parameters ( $\varepsilon_i$  and  $t_{ij}$ ) are obtained by **projection of Fock matrix of model fragments onto LMOs**
3. Effective Hamiltonian of a large system is obtained by its **fragmentation into the model fragments**

## Why LMO-based approach is working:

- Slater determinant is invariant under rotations of 1e orbitals
- Locality of phenomena: locality of 1e-density matrix and Hamiltonian, often only local SCF is important

[V Heine, Solid State Phys 35, 1 (1980)]

# Localization of molecular orbitals for coarse-graining

- Localization procedure is not unique *Acc Chem Res* 47, 2758 (2014) (trade off between spatial and energy localization)
- Projection approaches are **scalable and robust**
- Localization to unit cell is performed by Wannier functions
- The largest problem is bands entanglement (e.g.  $\pi$  and  $\sigma$ )
- LMOs can be used to get SCF (*MOZYME* code in MOPAC, fragmentation methods *Chem Rev* 112, 632 (2012))

## Algorithm

1. Reduce to unit cell (Wannier, or cluster in PBC or OBC)
2. Define projector (quality of the projector is critical)
3. Select initial MO subspace, project, and refine MOs
4. Convert LMOs to CG-basis (e.g. by block diagonalization)

# Projecting MO to LMO

Open-source code MolMod/LocalizeMO

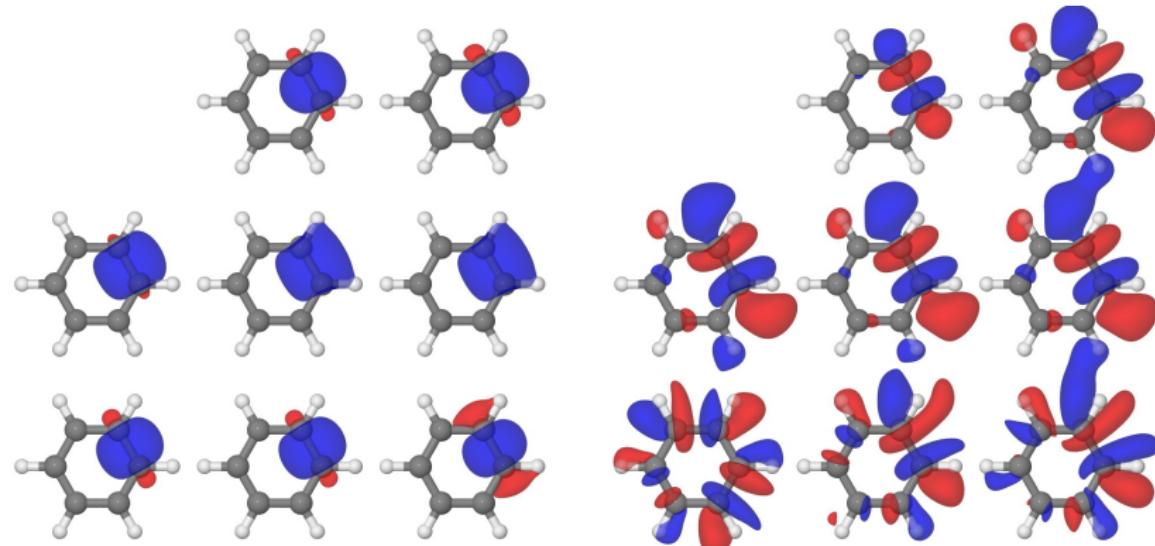
Project **on/in/out** by SVD of  $M^+SL$  or  $M^+P'SPM$ ,

where  $S$  – overlap,  $M$  – MOs,  $L$  – pre-LMOs,  $P$  – projector

Possible projector: subset of AOs (geometrical fragmentation)

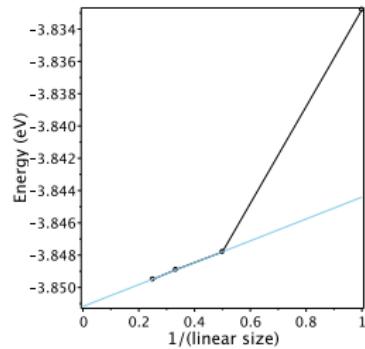
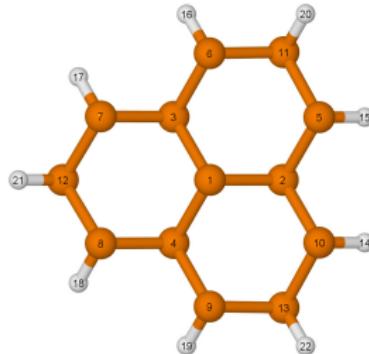
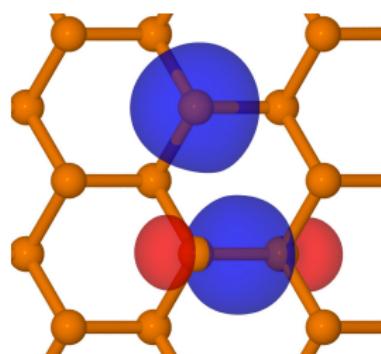
Possible pre-LMOs: LMOs by other method ('ad hoc' approach)

Example: benzene  $\sigma$  and  $\sigma^*$  LMOs (NBO/on/in/out/...)



# Locality and fast convergence of tight-binding parameters...

Illustrated by NBO analysis of the valence band of blue (A7) phosphorene

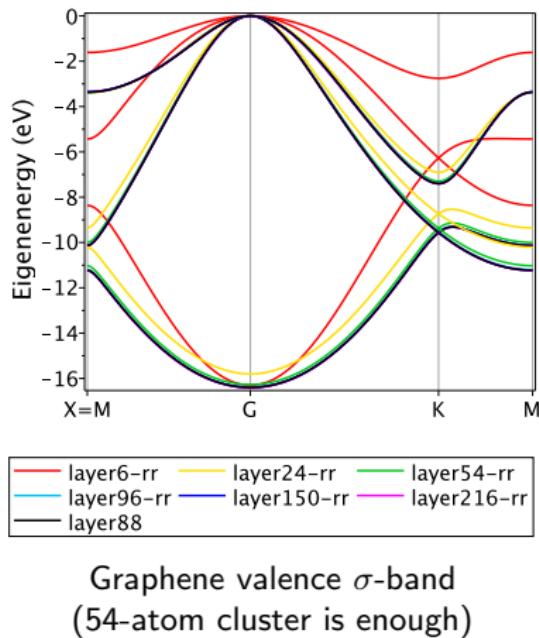
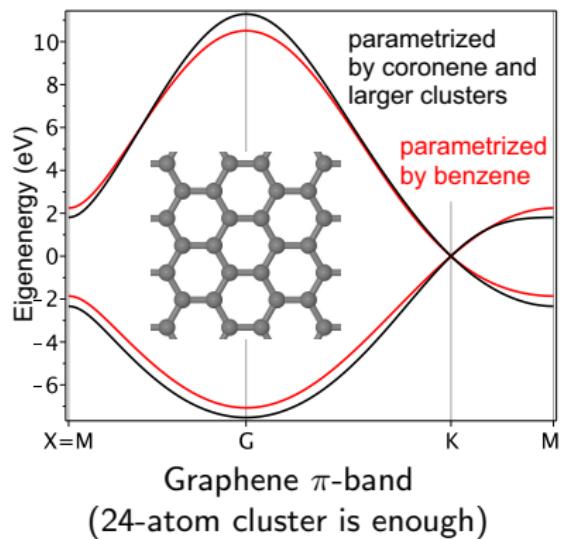


- There are two symmetry unique NBOs
- Error in estimation energy difference between them is 270 meV for the smallest cluster and 42 meV for the next one in series
- Error in estimation coupling between them is 18 meV for the smallest cluster and 3 meV for the next one in series

*Already the smallest fragment can be used for transfer integrals*

... small clusters are enough for parametrization

Example of hydrogen-passivated graphene clusters – graphene nanoflakes



# Methodology of ECG

## Requirements:

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  - Efficient parametrization of tight-binding models

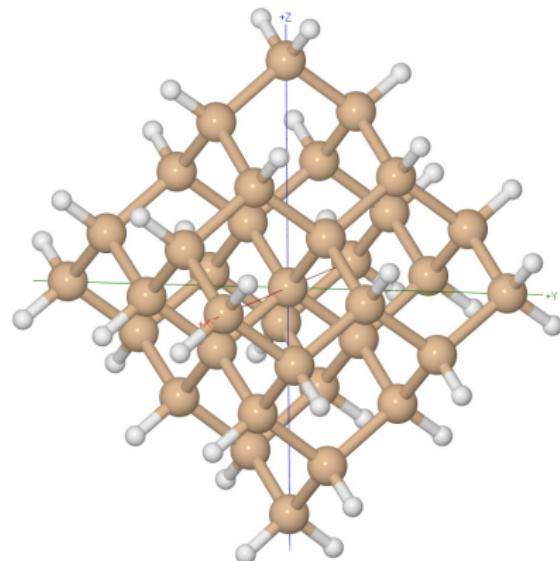
# Efficient parametrization of tight-binding (TB) models

## Approaches to first-principles parametrization:

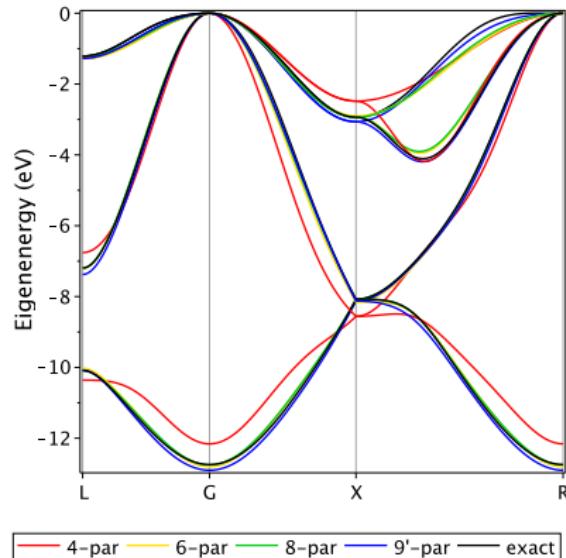
- Fit by one-electron energies (mainstream)
  - + Only energies are needed
  - Only energies are accurate for sure
  - Systematic accuracy improvement requires ML-fitting
  - ▶ Best for simple and minimal TB models
- Derive from Fock matrix (natural to ECG)
  - + Numerically exact in principle (no fitting)
  - + Transferable TB elements (e.g. cluster-to-solid)
  - More complicated in implementation
  - Wave-function is needed
  - ▶ Best for complex and accurate TB models

# Parametrization of TB models from cluster calculations

<https://cmsos.github.io/tbm>



Input: Cluster calculations (DFT)



Output: Symmetry-unique TB elements

# Technical challenges and solutions

<https://cmsos.github.io/tbm>

Use symmetry for TB model formulation, solution, and parametrization

- 10 bonds in diamond  $\Rightarrow$  100 symmetry-unique dimers  $\Rightarrow$  5000 dimers per primitive cell  $\Rightarrow$   $10^7$  comparisons
- **FiniteGroups package** identifies 1500 symmetry-unique dimers in diamond per minute
- Wave-function symmetry is currently supported only for 1 orbital per site models – enough for valence *sp*-orbitals

Use library of electronic structure prototypes

- Structurally different materials might have the same TB model
  - ▶ Triangular lattice – herringbone packing
  - ▶ Honeycomb lattice – brickwork packing of A-D-A molecules
  - ▶ K4 lattice – wiremesh packing of A-D-A molecules
- We can compare materials by their effective Hamiltonians rather than computed properties

# Applications of ECG

## Calculate electronic structure of infinite systems:

- Solids of large flexible molecules such as A-D-A molecules  
Chem Mater 33, 966 (2021); JCP 159, 024107 (2023)
- Polymers: electronic structure of a single polymer chain  
Chem Sci 8, 1146 (2017), Solar Energy 198, 605 (2020)
- Polymers: electronic structure of crystalline polymers

work in progress

## Analyze localized states in infinite systems:

- Metal-organic polymers and frameworks  
Chem Sci 13, 8161 (2022)
- Polarons in non-polar semiconductors  
JPCL 12, 4674 (2021)
- Traps in organic semiconductors

work in progress

# Summary

- Electronic Coarse-Graining is a powerful tool (sometimes the only one) for calculation and analysis of electronic structure of complex systems:
  - ▶ Anything that can be monomerized (polymers, COFs, MOFs)
  - ▶ Solids and clusters of large molecules
  - ▶ Defects in solids
  - ▶ Infinite systems from finite-size calculations

Project web-page:

- Electronic Coarse-Graining  
<https://zhugayevych.me/research/ECG.html>
- Computational Materials Science of Organic Semiconductors  
<https://cmsos.github.io>