

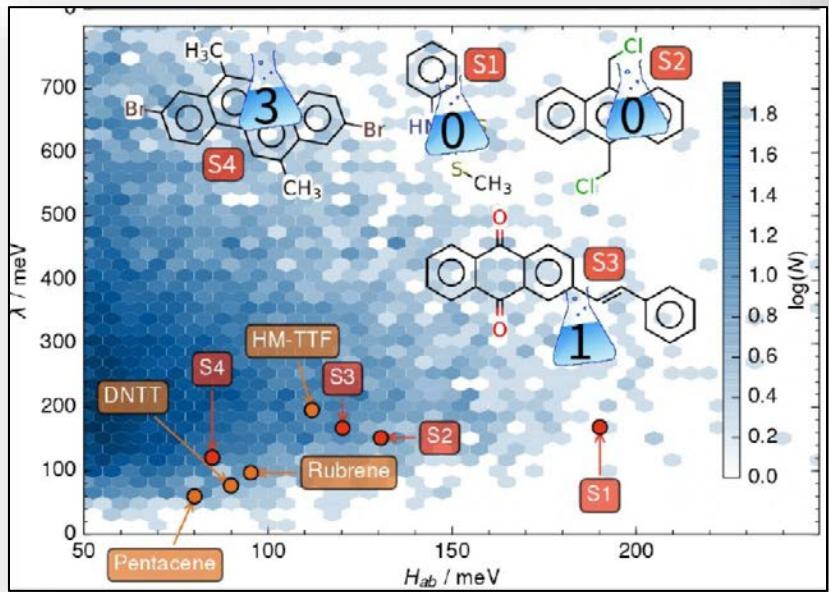
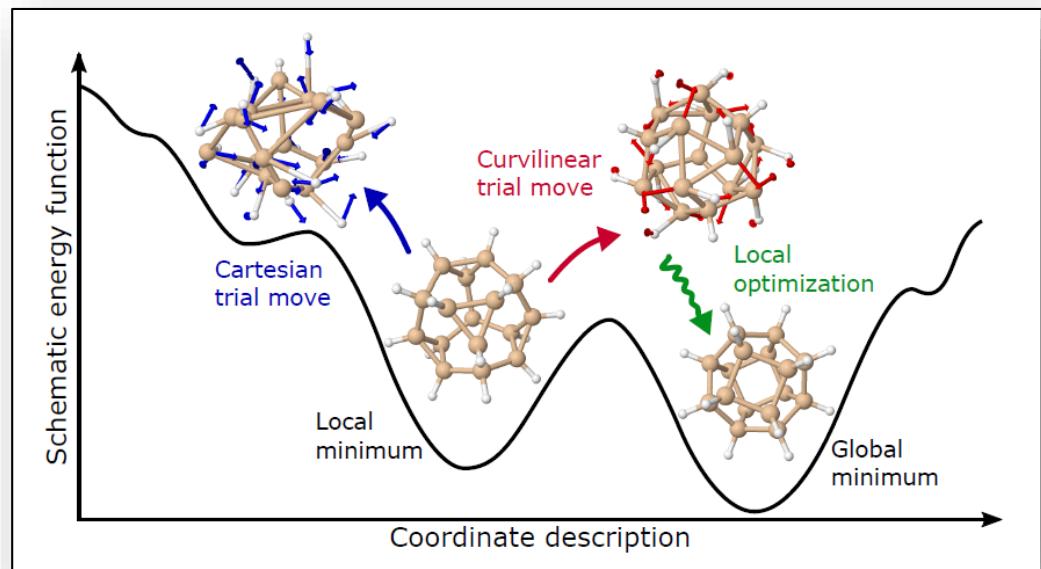
Exploring Discrete and Continuous Landscapes

Karsten Reuter

**Chemistry Department and Catalysis Research Center
Technische Universität München**

$$f = f(\{\vec{R}_i\}, \{Z_i\})$$

Global materials structure search with chemically motivated coordinates

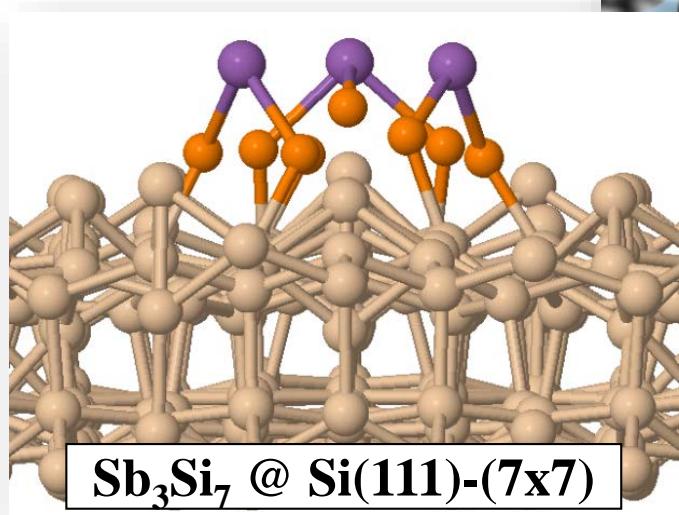
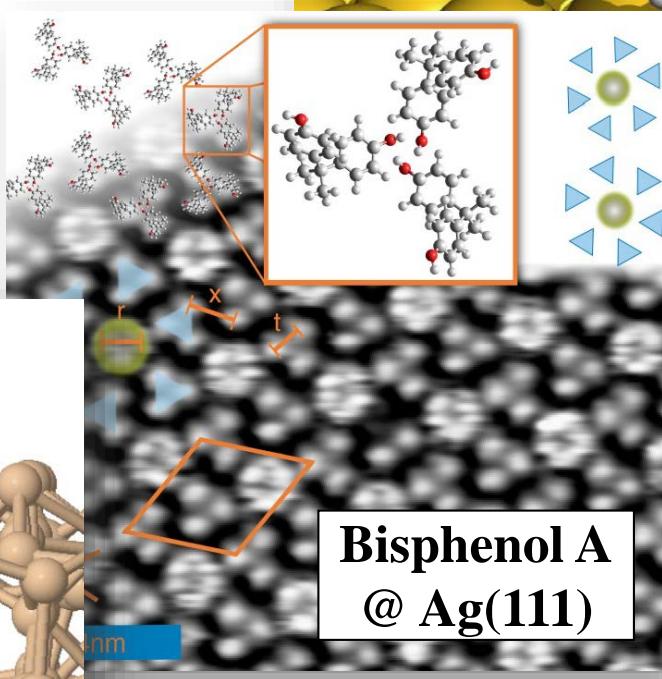
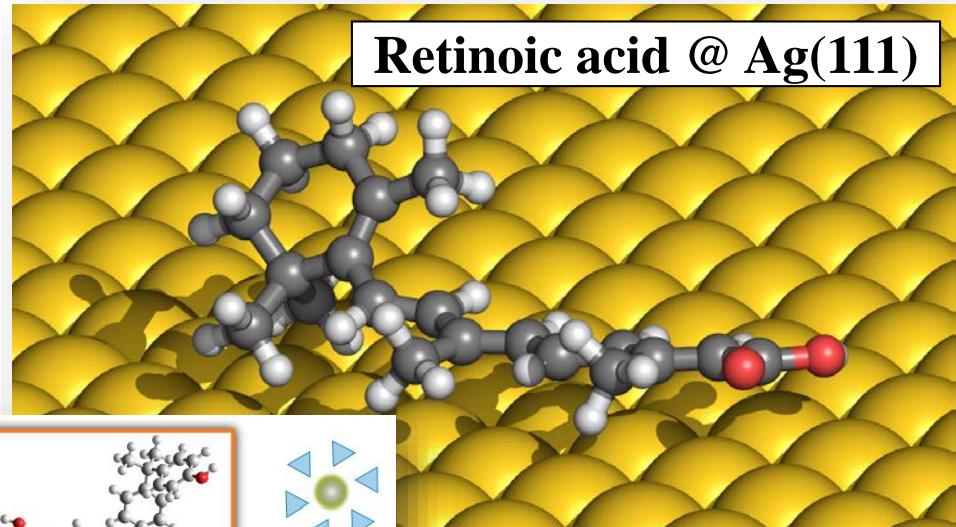


Computational screening for high carrier mobility in organic solar cells

Configurational spaces in the nanoworld

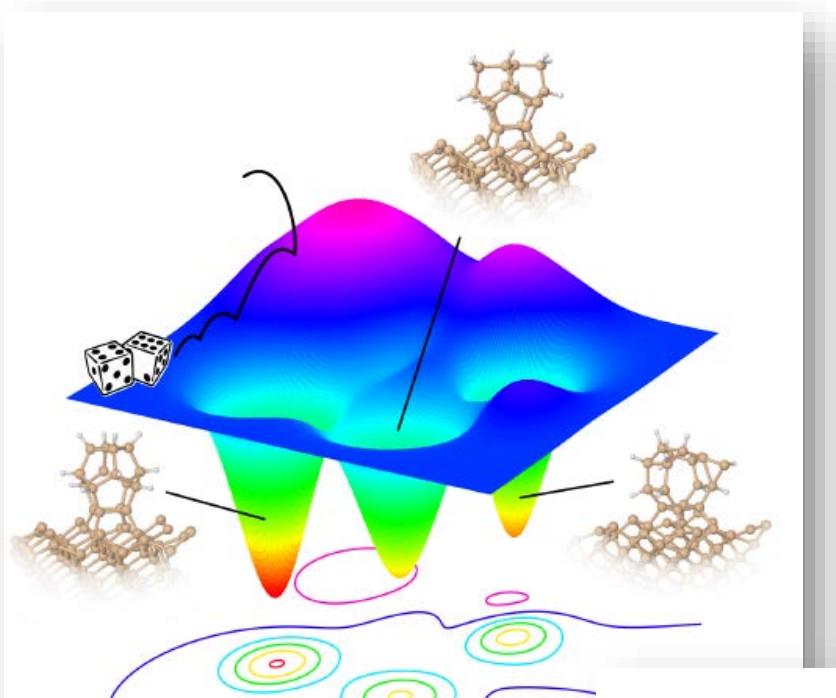
Functional molecules
Molecular networks
Surface reconstructions

...

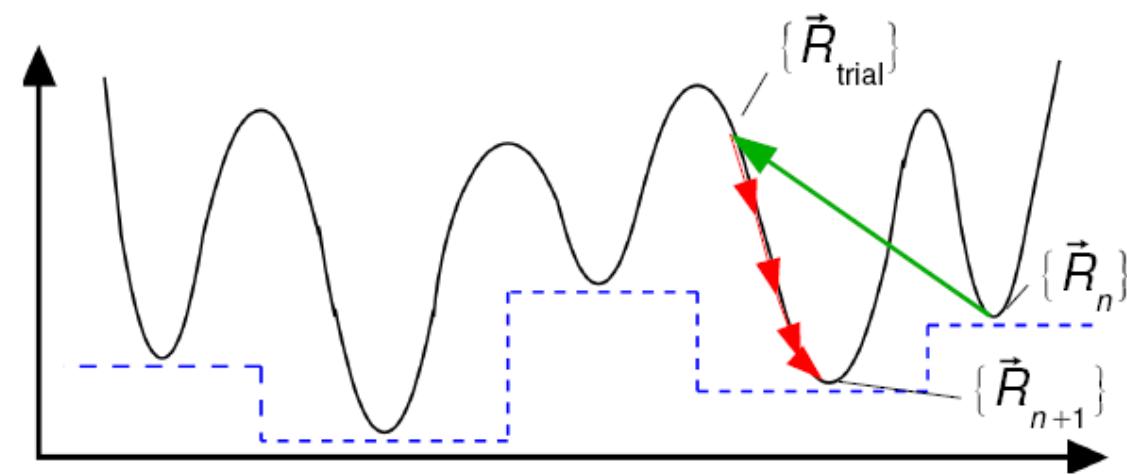


Structure is the key...

Navigating materials space: Global geometry optimization



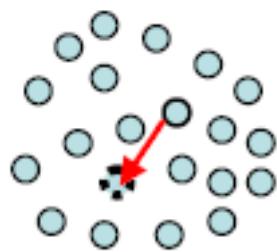
**Basin hopping
Genetic algorithms
Minima hopping
...**



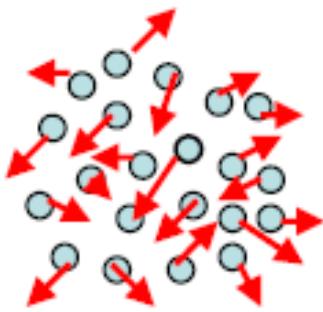
e.g. D. Wales *et al.*,

Adv. Chem. Phys. 115, 1 (2000)

A common, but chemically blind feature



single-particle move



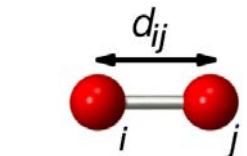
collective move

Trial structure generation
through discontinuous
random „moves“

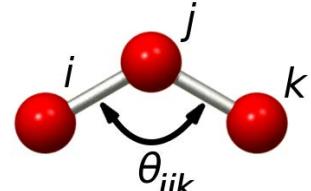
Cartesian coordinates (CCs):

- ✓ unbiased and universal
- ✓ intuitive (also from programmer's POV)
- ✗ can easily lead to unphysical configurations
- ✗ difficult to „constrain“/“preserve“ structural motifs

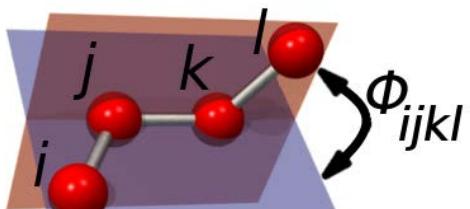
A more “chemical” alternative?! Curvilinear displacements



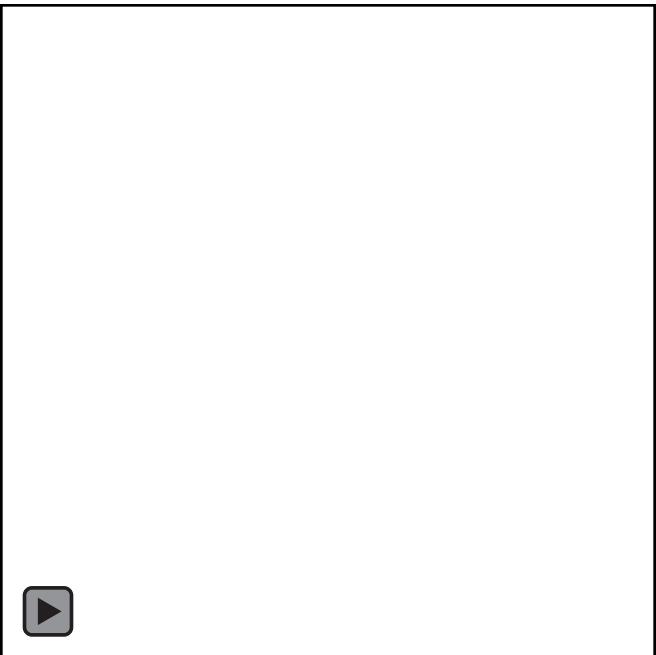
bond lengths



bond angles



torsions



Non-redundant set of
linear combinations of internal coordinates

e.g.
C. Peng *et al.*,
J. Comp. Chem.
17, 49 (1996)

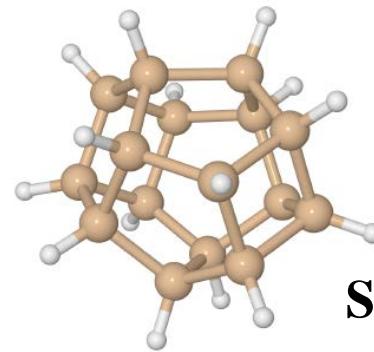
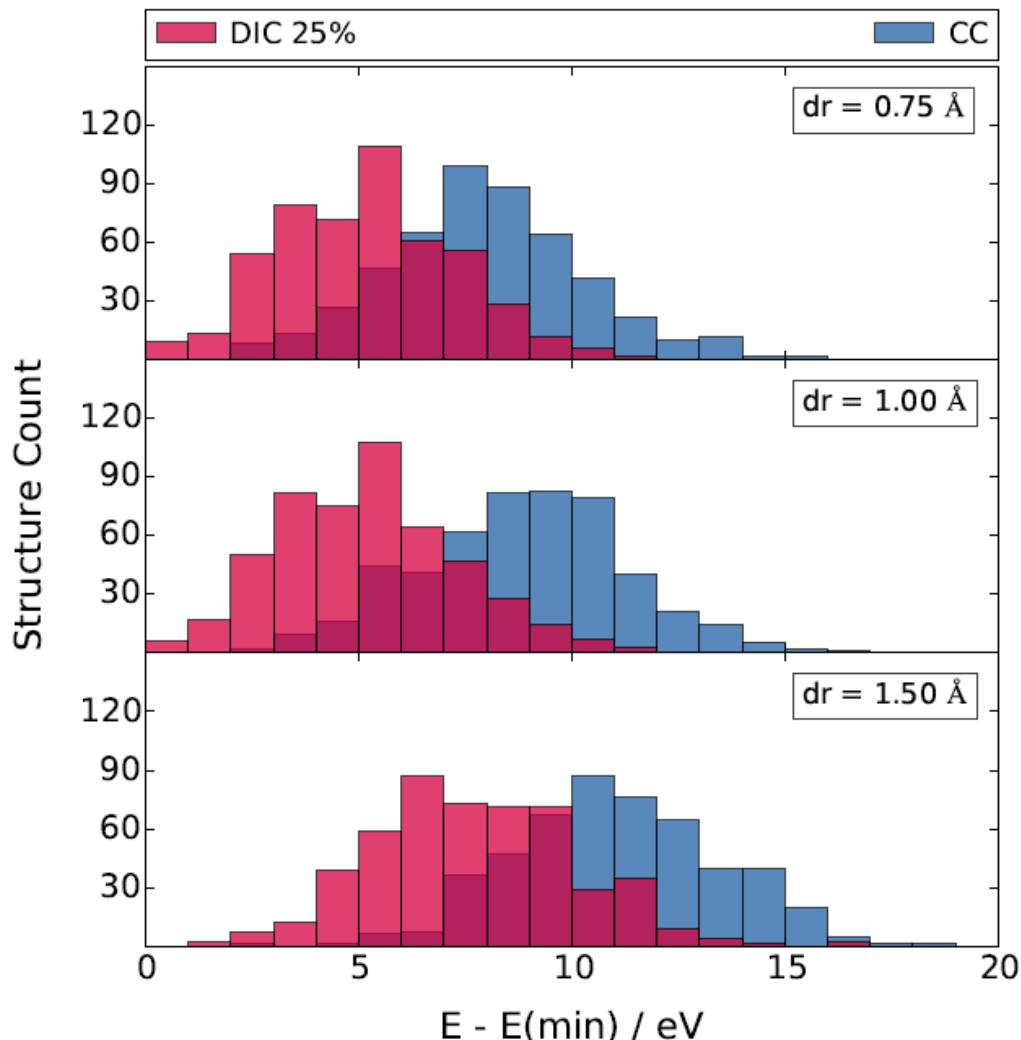
Hydrogenated Si clusters: Do not break, but still sample...

Si_{16}H



Performance check

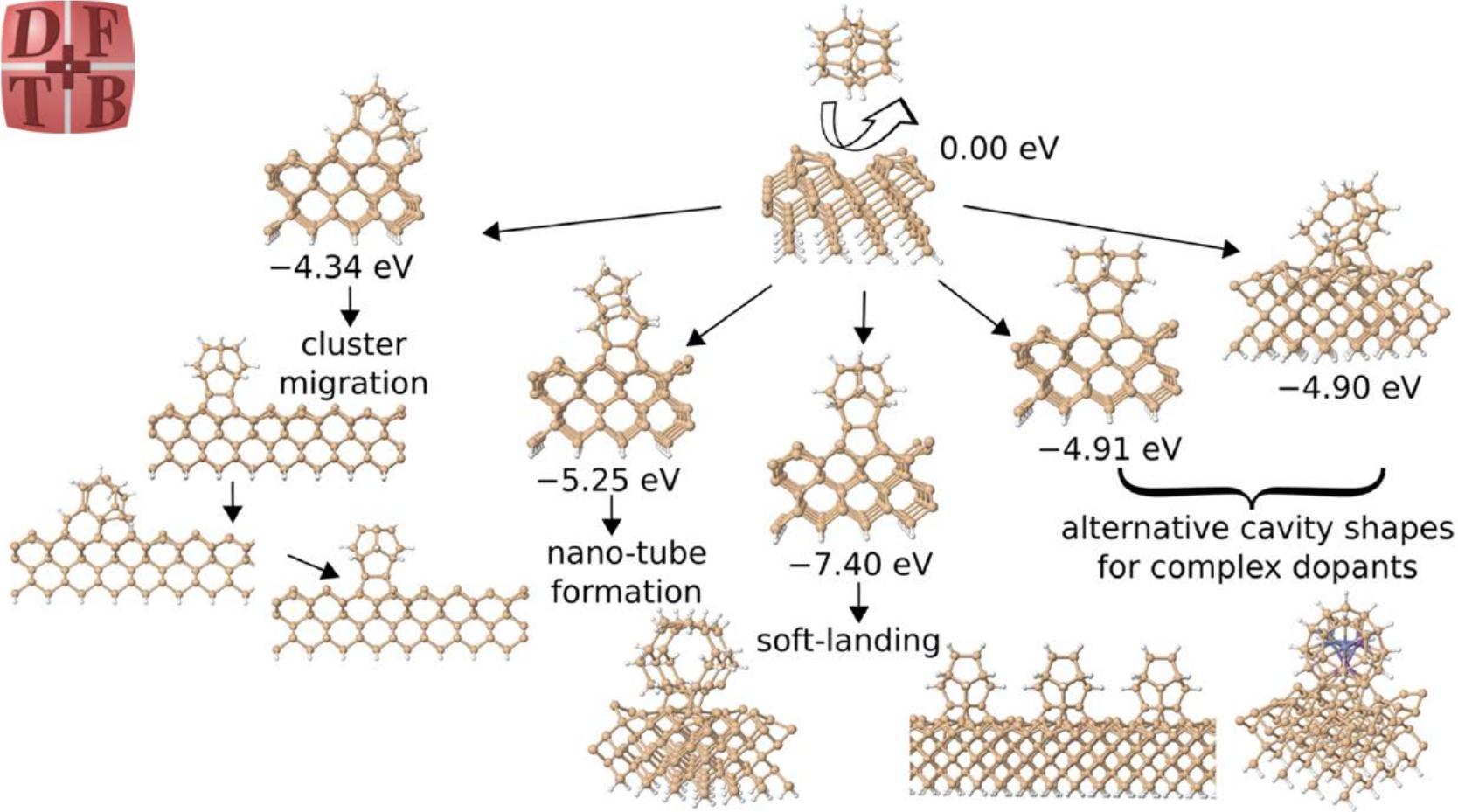
500 trial moves



Preferential sampling
of (intact!)
low-energy structures

$\text{Si}_{16}\text{H}_{16}$ at Si(001)

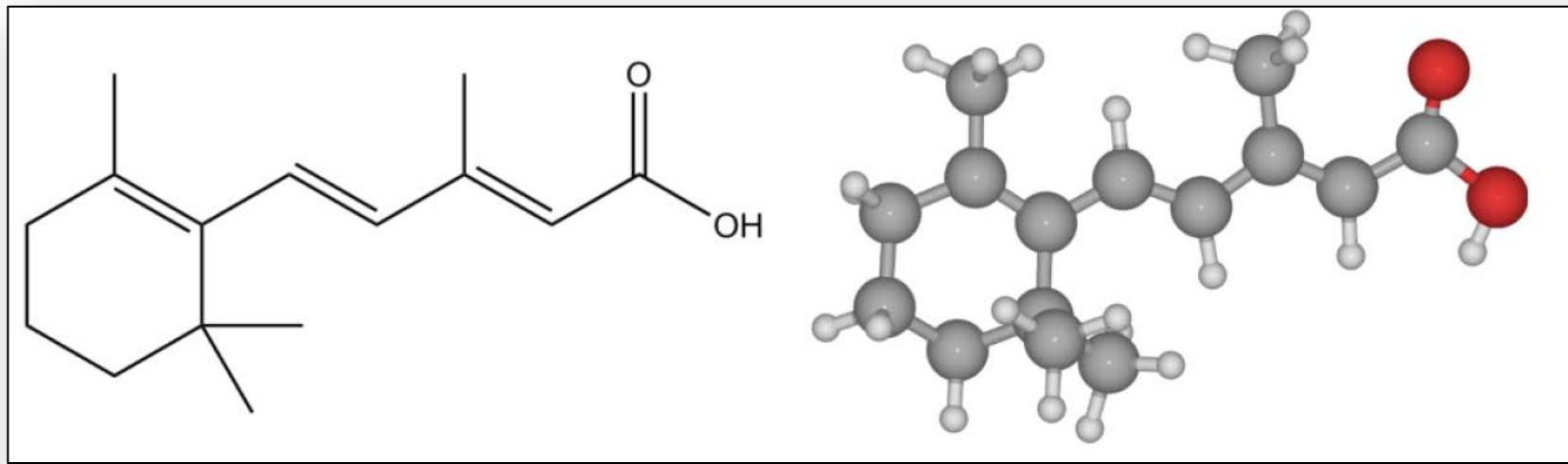
D
F
+
T
B



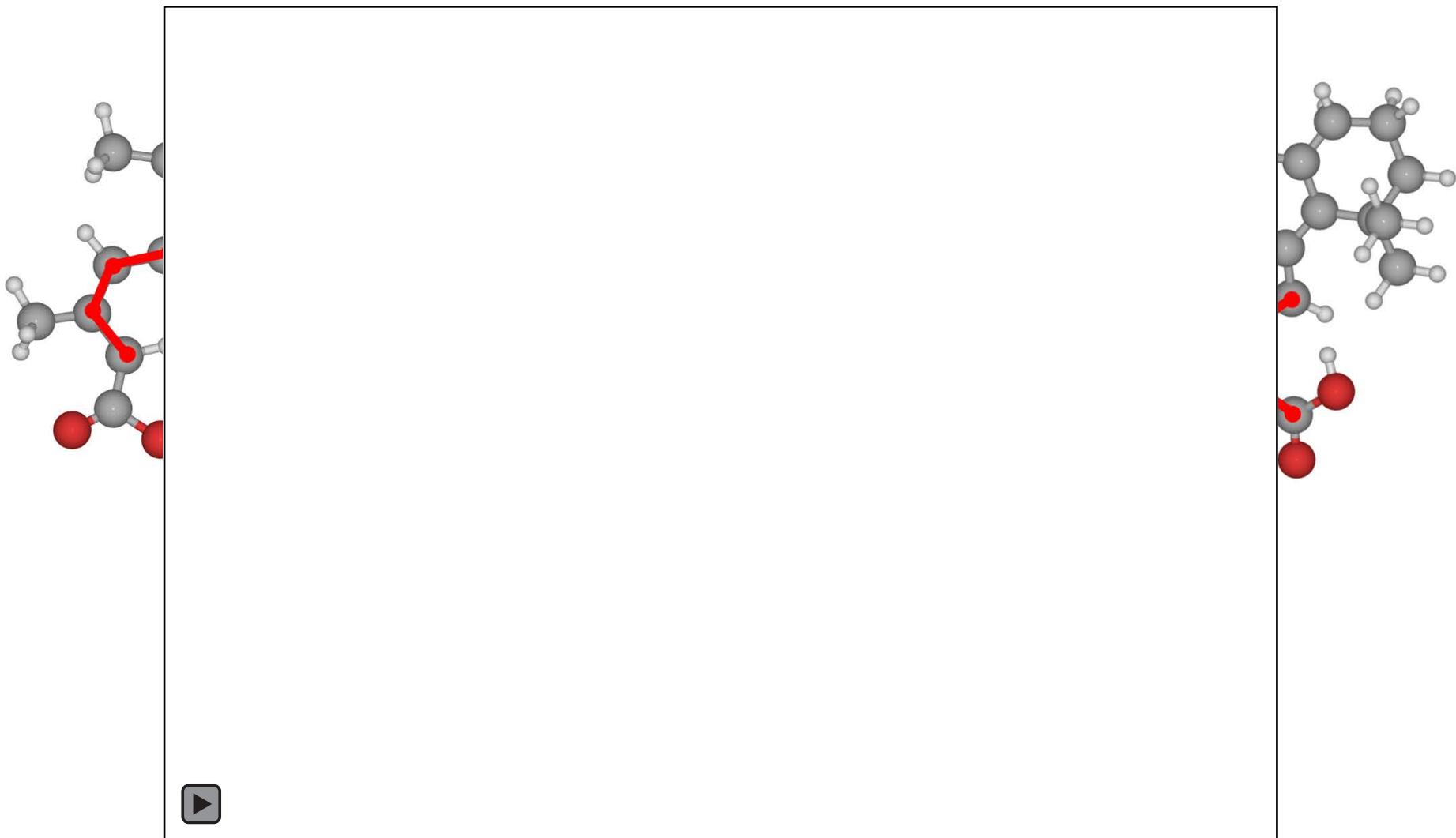
Constraint searches in chemical space

- Structural integrity particularly important for (organic) molecules
- Application of bond-conserving constraints straightforward in DICs

trans- β -ionylideneacetic acid (β -acid)

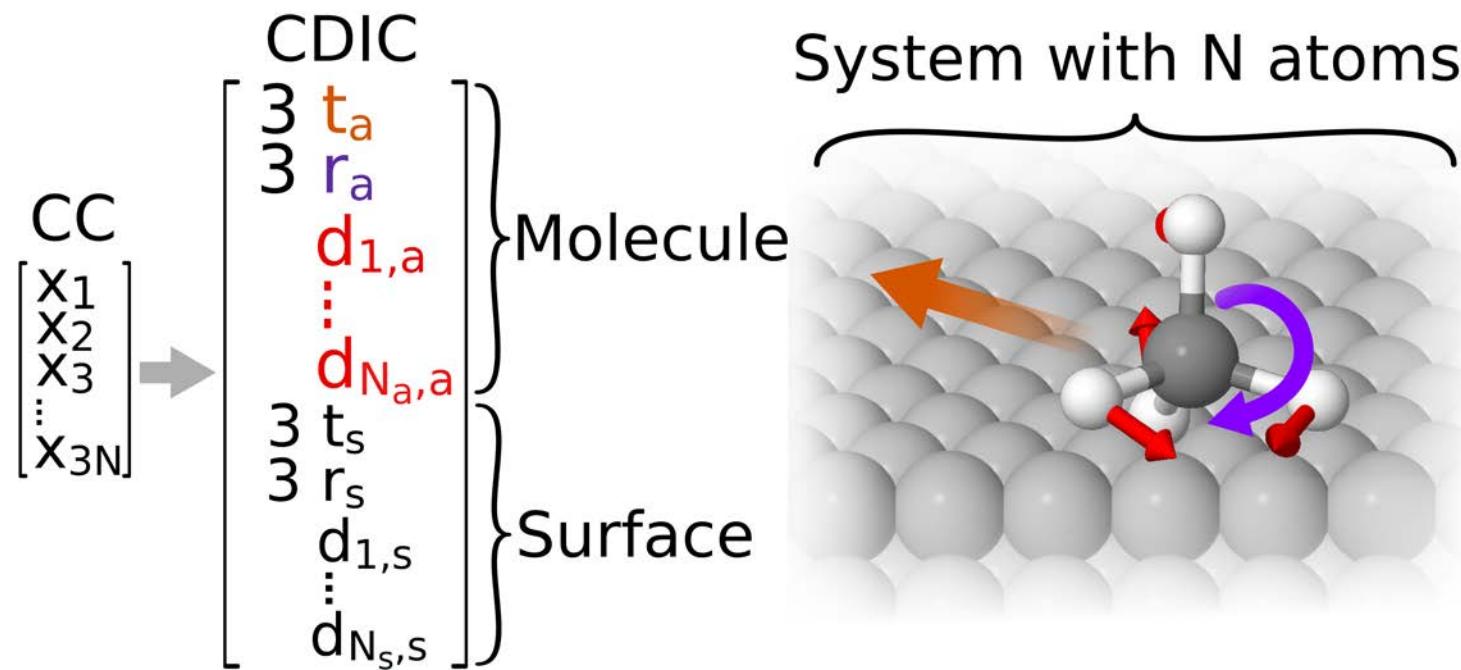


β -acid @ Au(111)



Sub-system rotations and translations: Complete DICs

- DICs filter out translations and rotations by construction
- Translations and rotations of sub-systems can be reintroduced by constructing DICs for sub-systems separately and building complete DICs (CDICs) from those

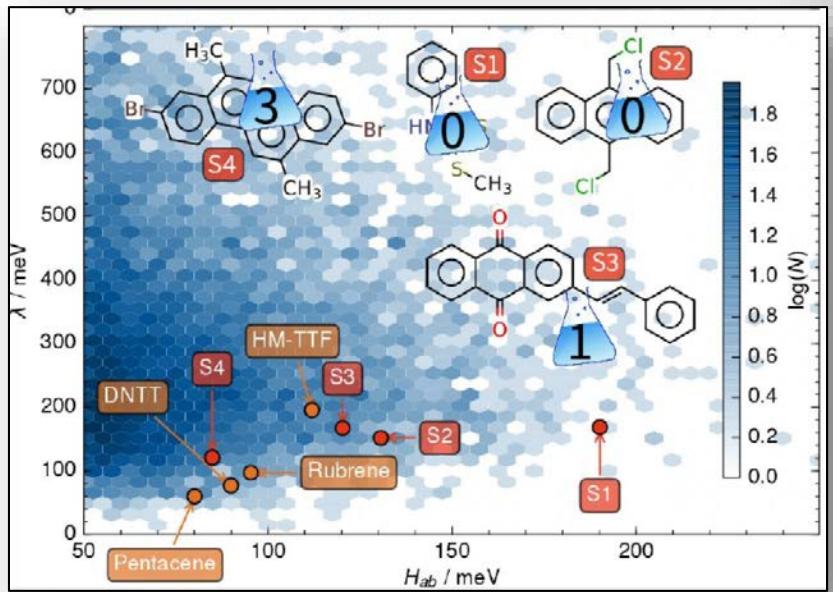
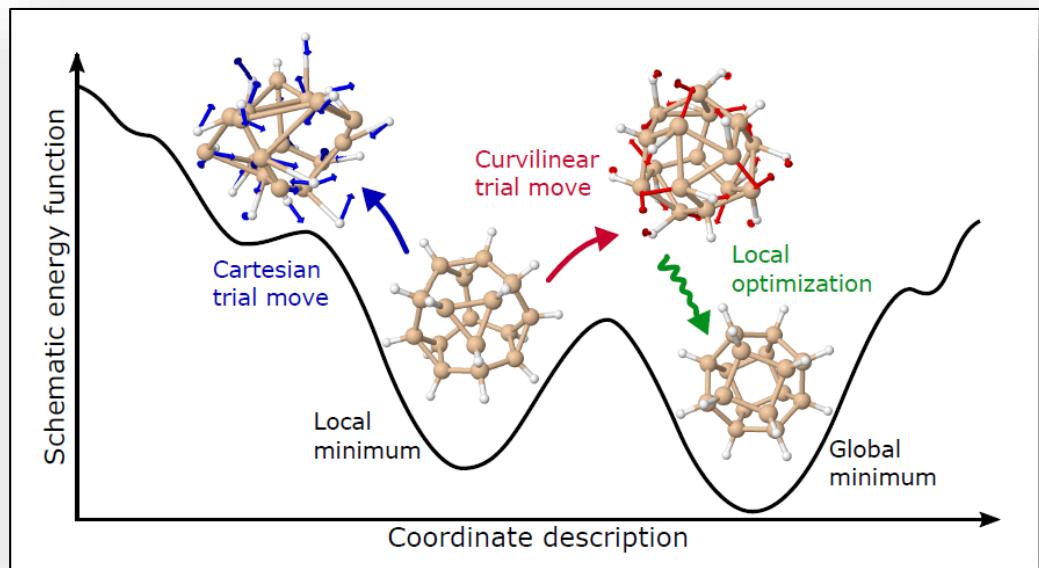


Lateral sampling: CH₄ @ Ag(111)



$$f = f(\{\vec{R}_i\}, \{Z_i\})$$

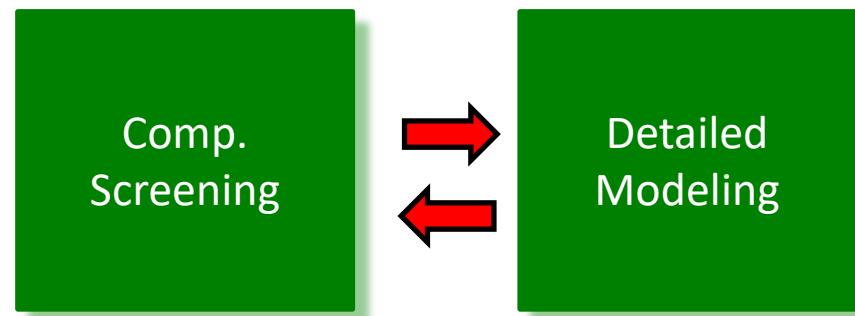
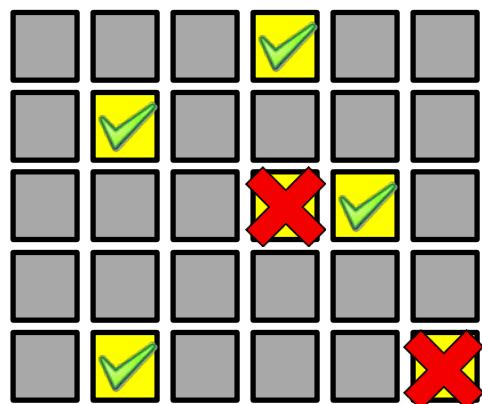
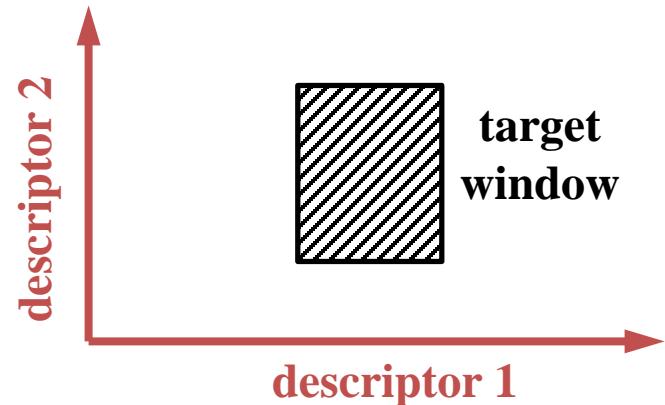
Global materials structure search with chemically motivated coordinates



Computational screening for high carrier mobility in organic solar cells

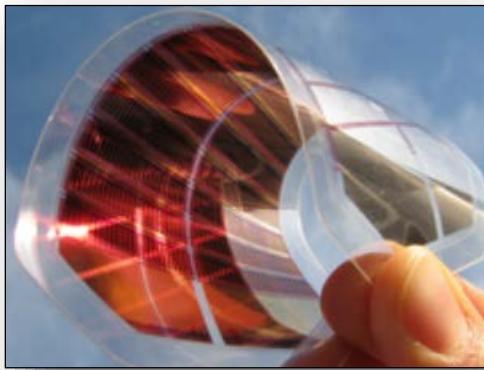
Computational screening: Trends over accuracy

- Exploration of chemical space far beyond the capabilities of real synthesis
- Focus on numerically undemanding descriptors for efficient screening
- Multi-dimensional descriptors (data mining...)

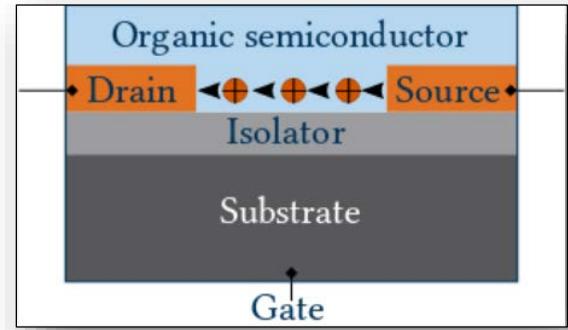


- Trends require lower accuracy
- Not every candidate must be correct (?!)
- As simple as possible, but not simpler...

Charge carrier mobility in organic solar cells: A key device parameter



$$\mu_{ij} = \frac{\partial \langle v_i \rangle}{\partial E_j}$$



Theories to calculate μ_{ij} :
Band theory – small polaron hopping – model Hamiltonians

Common to all theories:

$$\mu_{ij} \sim H_{ab}$$

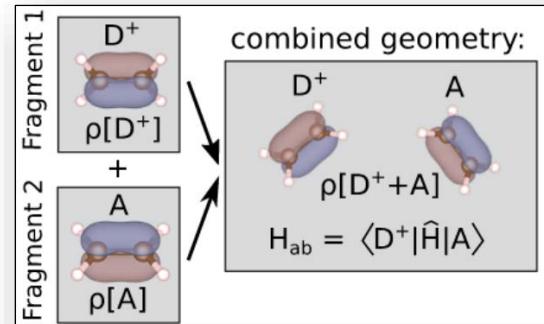
$$\mu_{ij} \sim \lambda$$

Electronic coupling
Reorganization energy

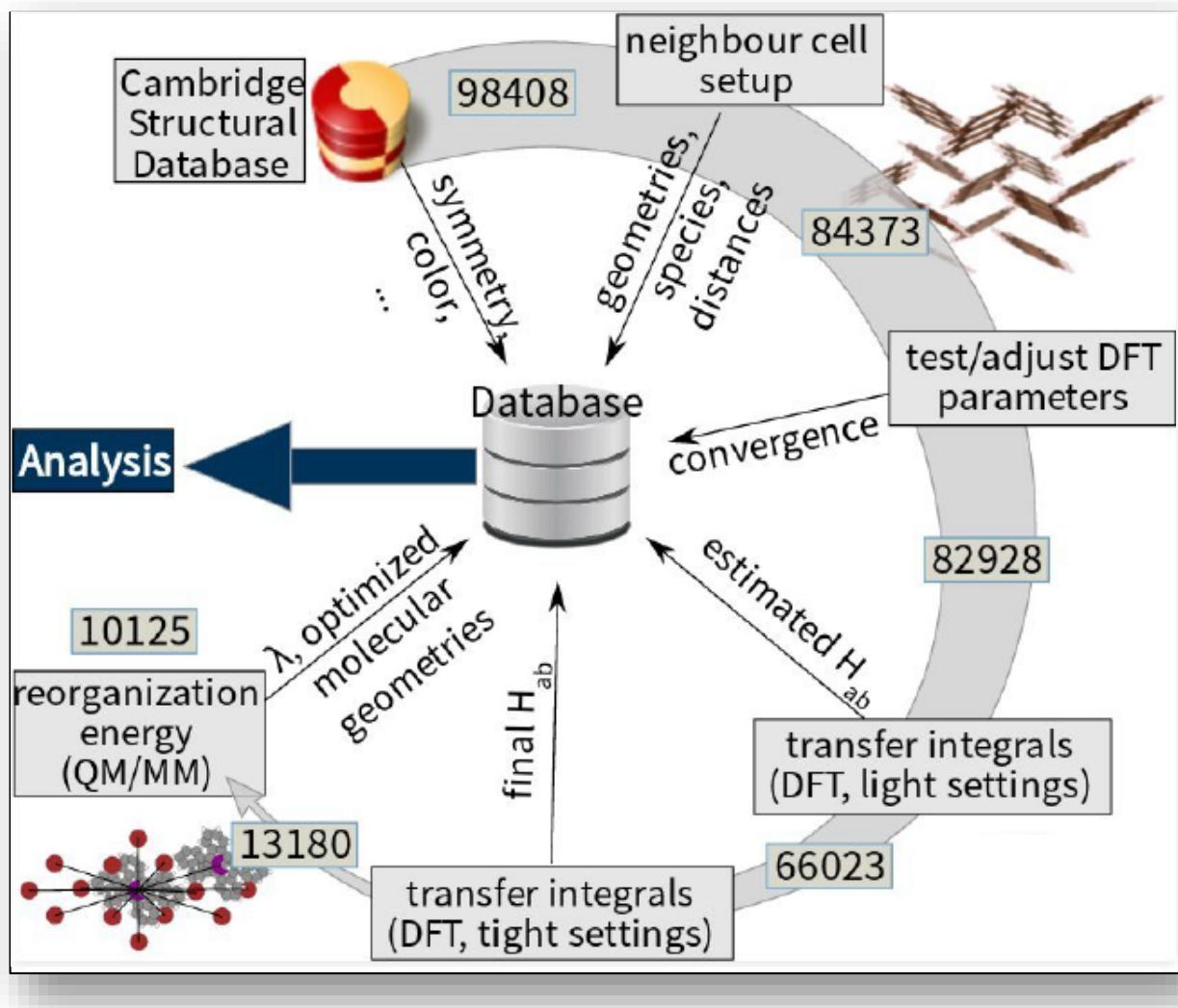
H. Oberhofer, K. Reuter, and J. Blumberger, Chem. Rev. 117, 10319 (2017)

Approximate, but efficient calculation
of $H_{ab}/\lambda_{\text{intra}}$ through fragment-orbital DFT:

C. Schober, K. Reuter, and H. Oberhofer
J. Chem. Phys. 144, 054103 (2016)



Automated materials screening



LAMMPS

ASE

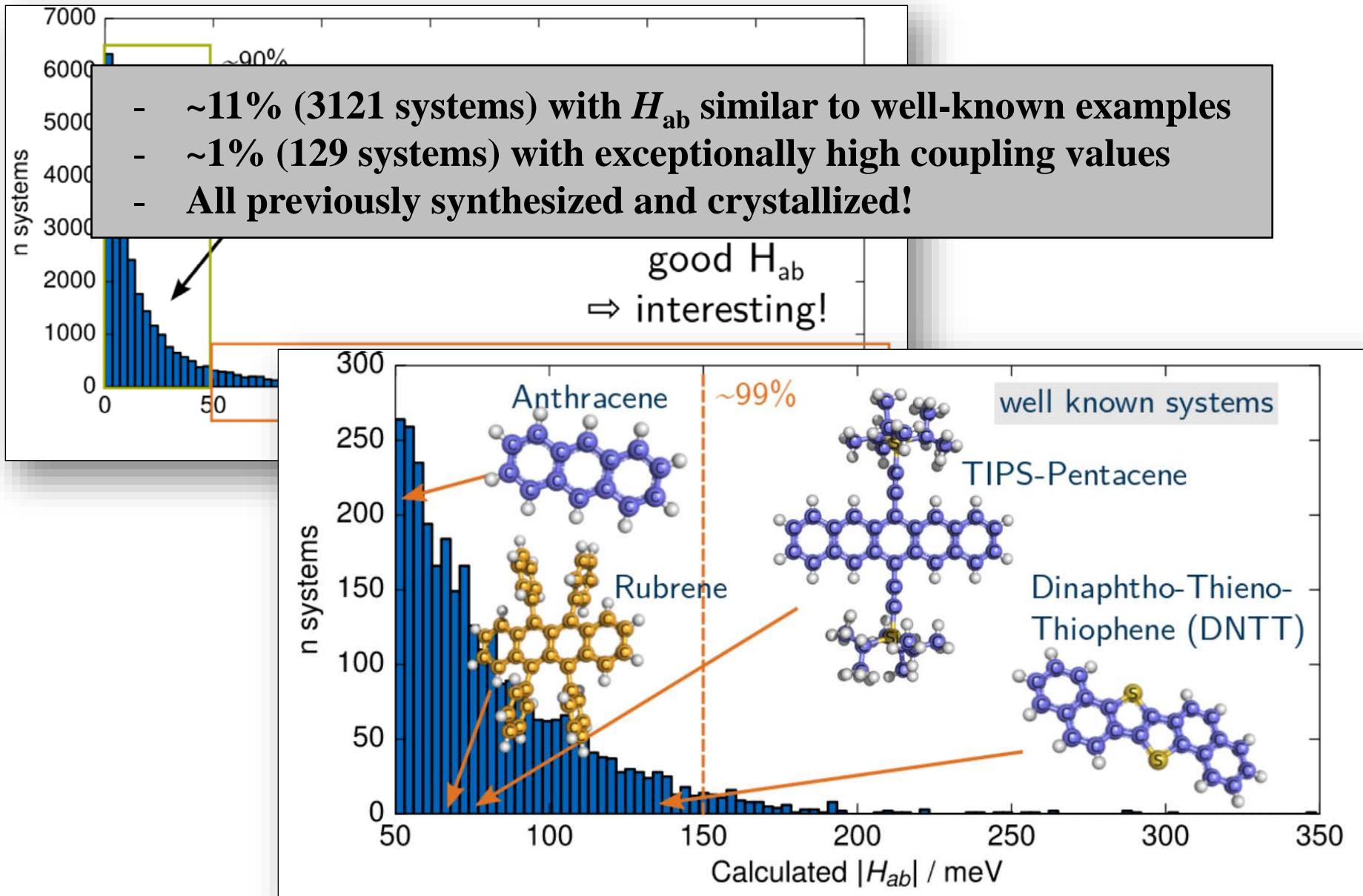


FireWorks

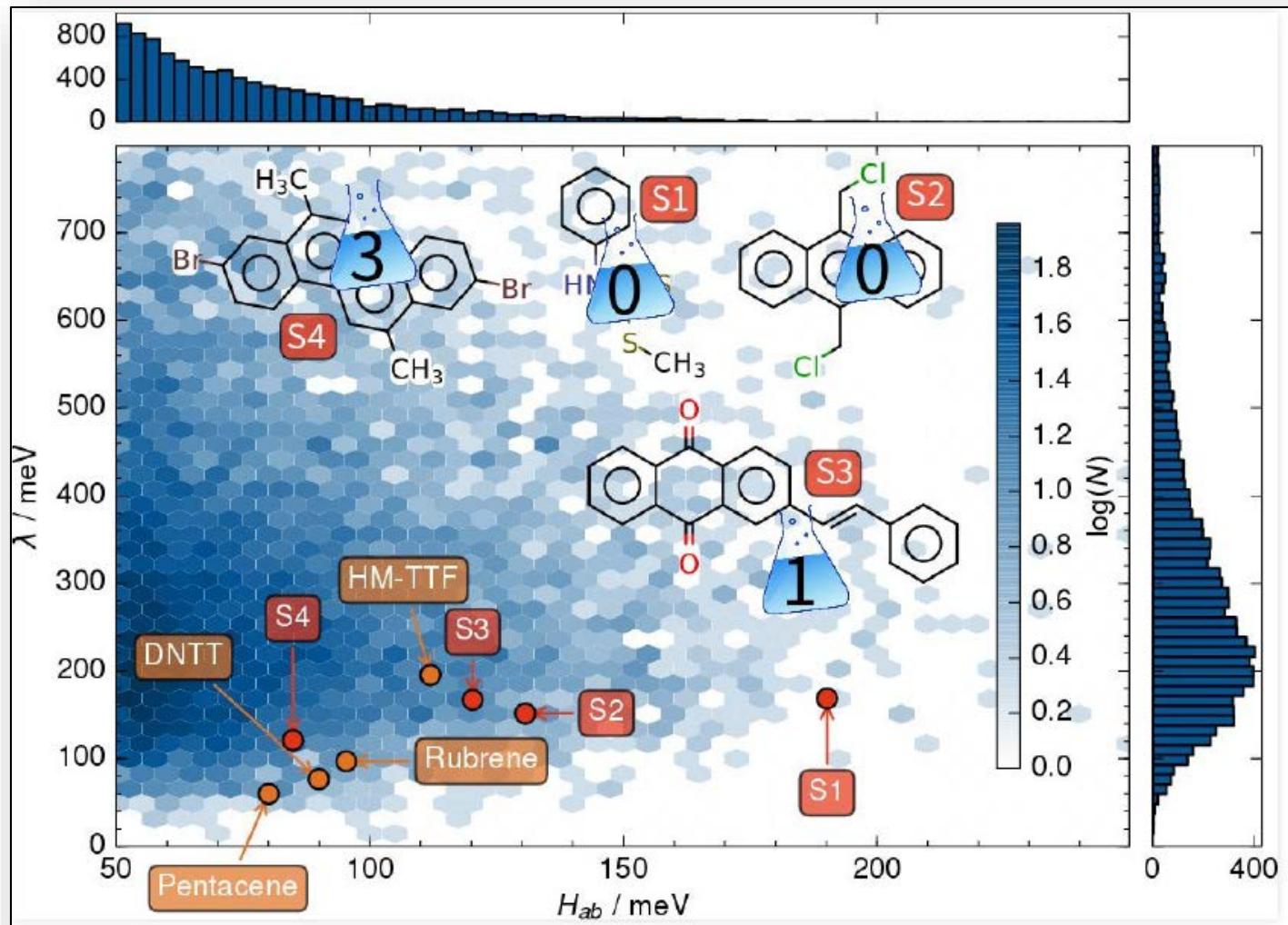
mongoDB

PyData

H_{ab} screening results



$H_{ab} / \lambda_{\text{intra}}$ screening results

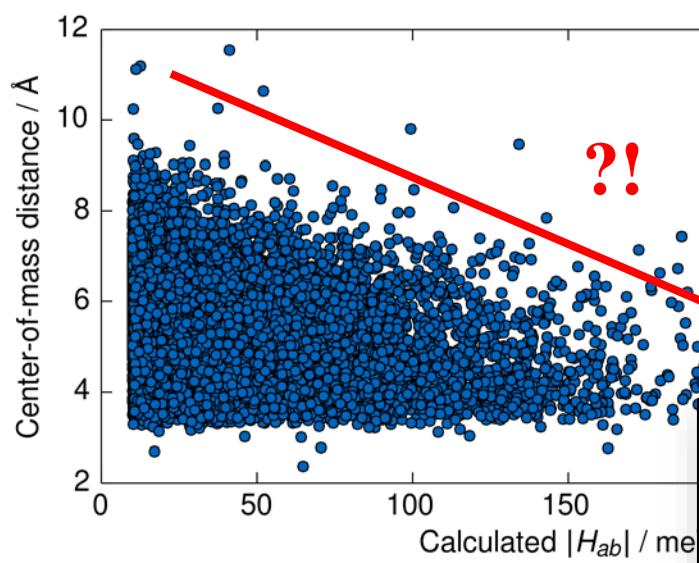


What else can we learn?

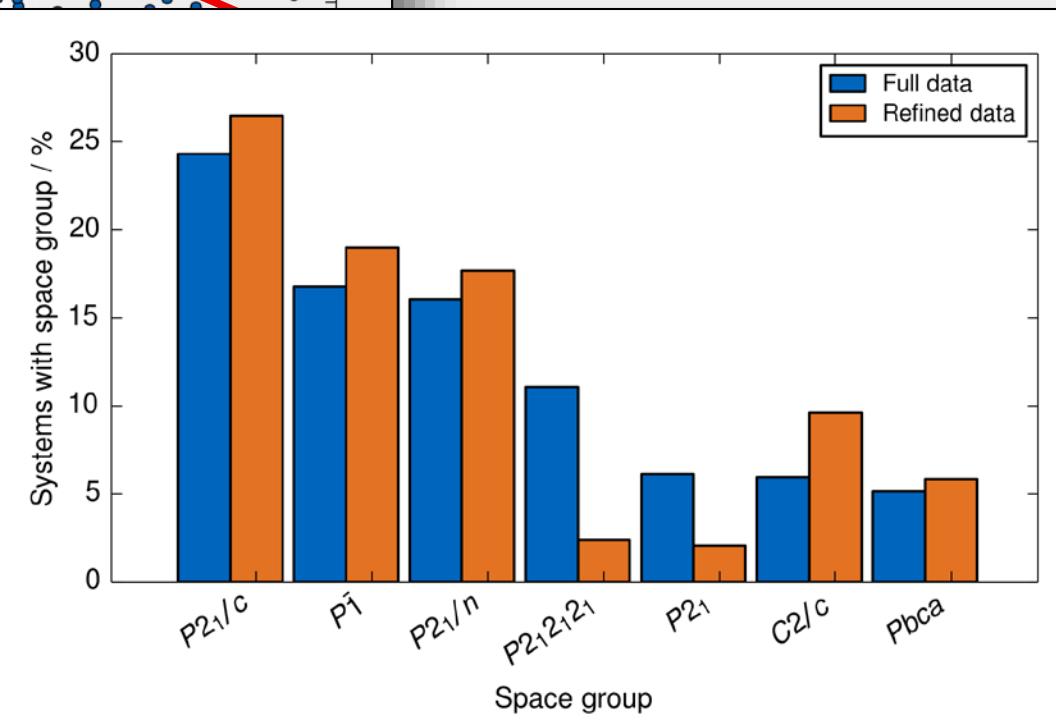
publication date		
crystal color	space group	
Crystal structure / cif	unit cell	electronic coupling
X-ray measurement	cell formula units	HOMO energy
temperature		reorganisation energy
	center-of-mass distances	DFT calculations
		gap
Paper reference	minimum distances	optimized molecular geometry
		LUMO energy
NumAromaticCarbocycles		
NumAliphaticCarbocycles		NumAliphaticRings
NumHDonors		NumHAcceptors
NumHeteroatoms	NumAromaticHeterocycles	NumSaturatedCarbocycles
NumAromaticRings	Structure / "Cheminformatics"	NumDoubleBonds
		NumValenceElectrons
	NumBonds	NumRotatableBonds
NumSaturatedHeterocycles		NumAromaticAtoms
	NumConjugatedBonds	NumSaturatedRings
NumAliphaticHeterocycles	NumAromaticBonds	
	NumRadicalElectrons	

Correlations? Structure-property relationships? ...

Scrutinizing simple indicators

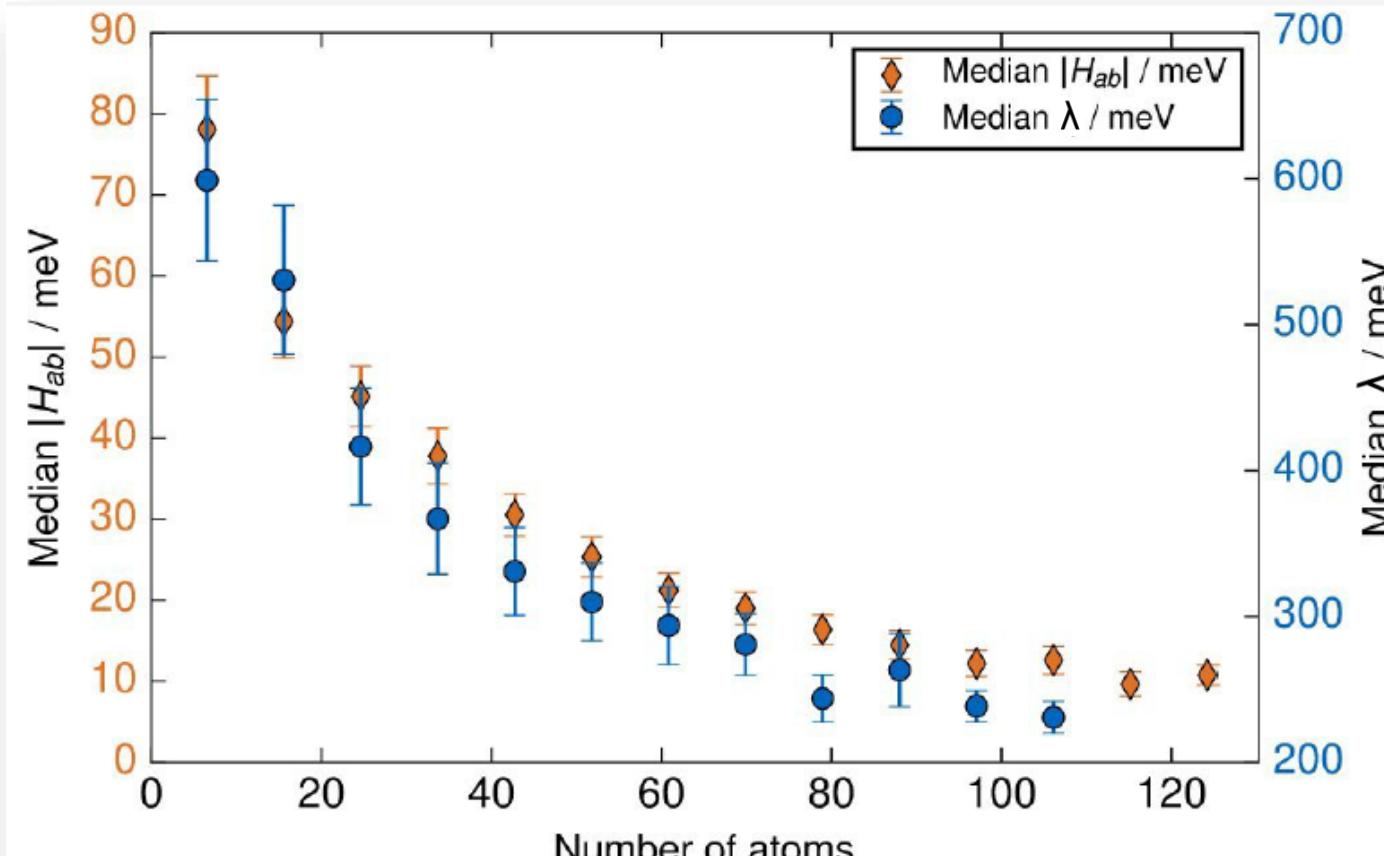


Close distances
good for transport?



Particular space groups
good for transport?

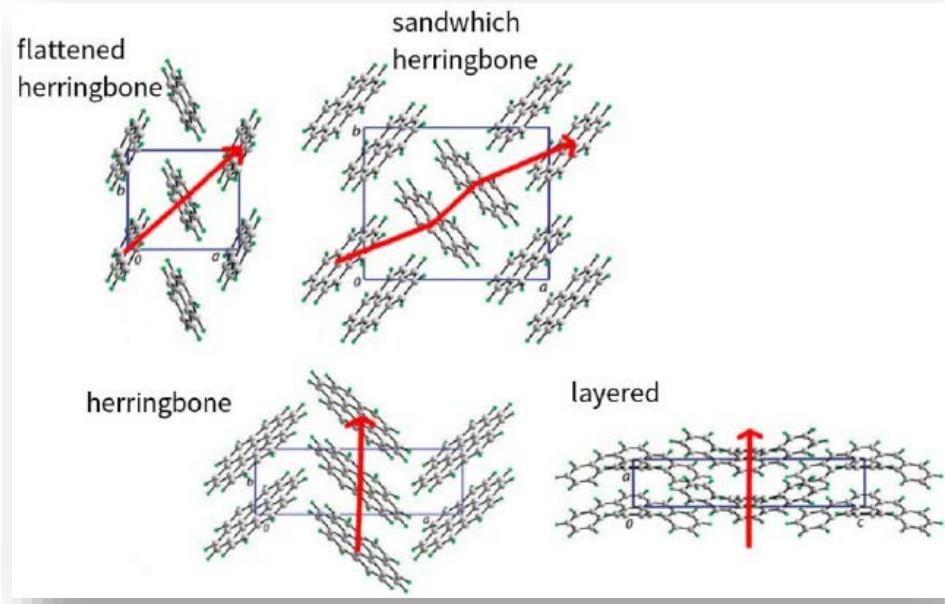
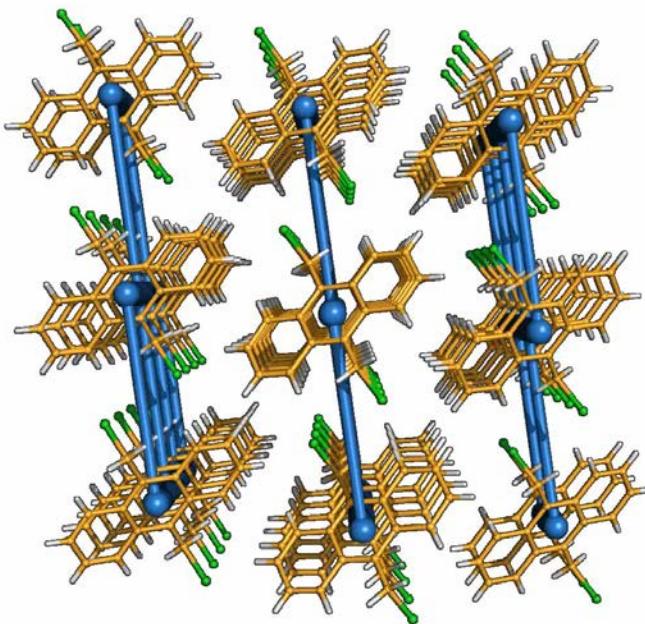
Size effects on H_{ab} and λ_{intra}



Interesting systems (high H_{ab} / low λ_{intra}) are outliers to this trend

Percolation pathways

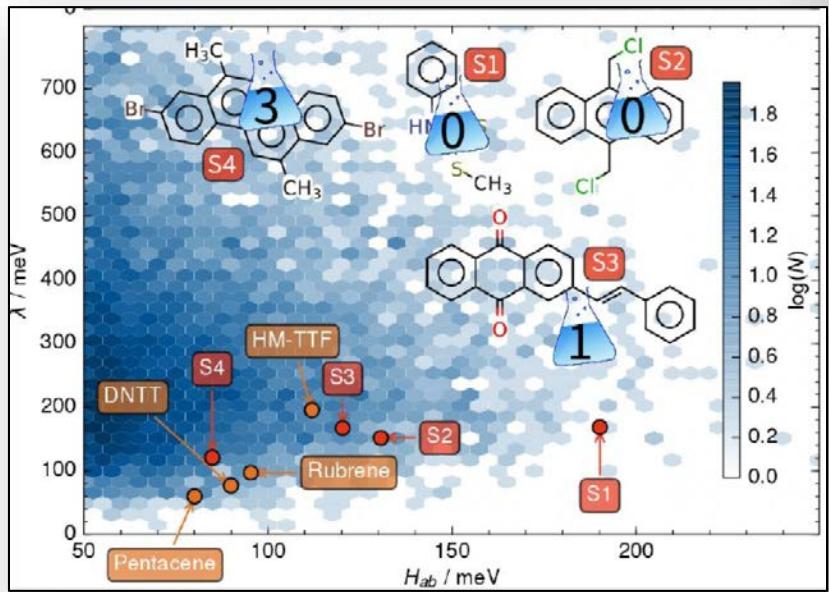
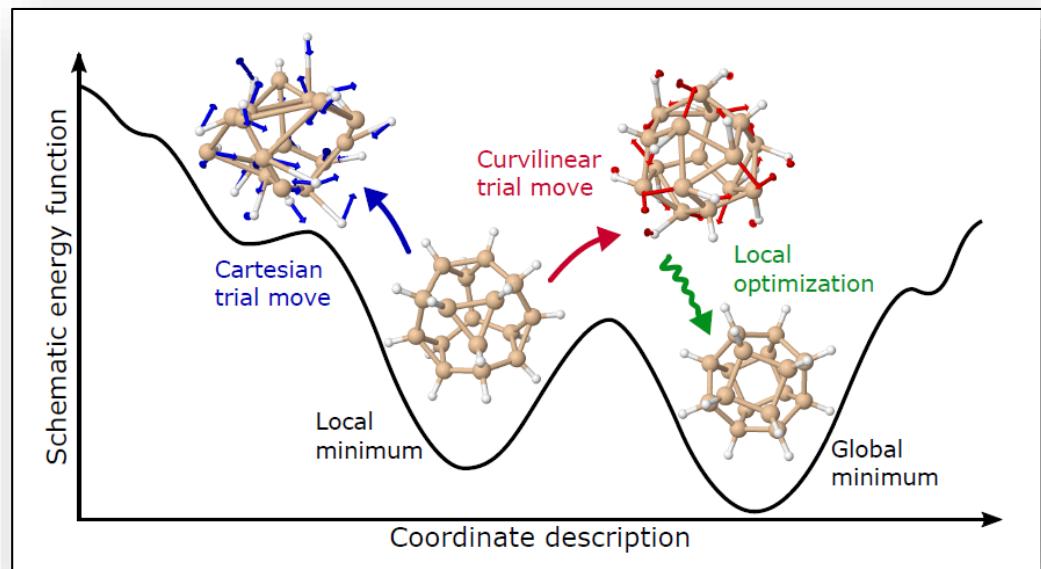
Long-range charge percolation pathways are important for good mobility



Automatized detection of pathways based on calculated H_{ab} and crystal structure

$$f = f(\{\vec{R}_i\}, \{Z_i\})$$

Global materials structure search with chemically motivated coordinates



Computational screening for high carrier mobility in organic solar cells

Thanks so much!



Chiara Panosetti Konstantin Krautgasser Reinhard Maurer
(→ Warwick)



Christoph Schober Christian Kunkel Harald Oberhofer

www.th4.ch.tum.de