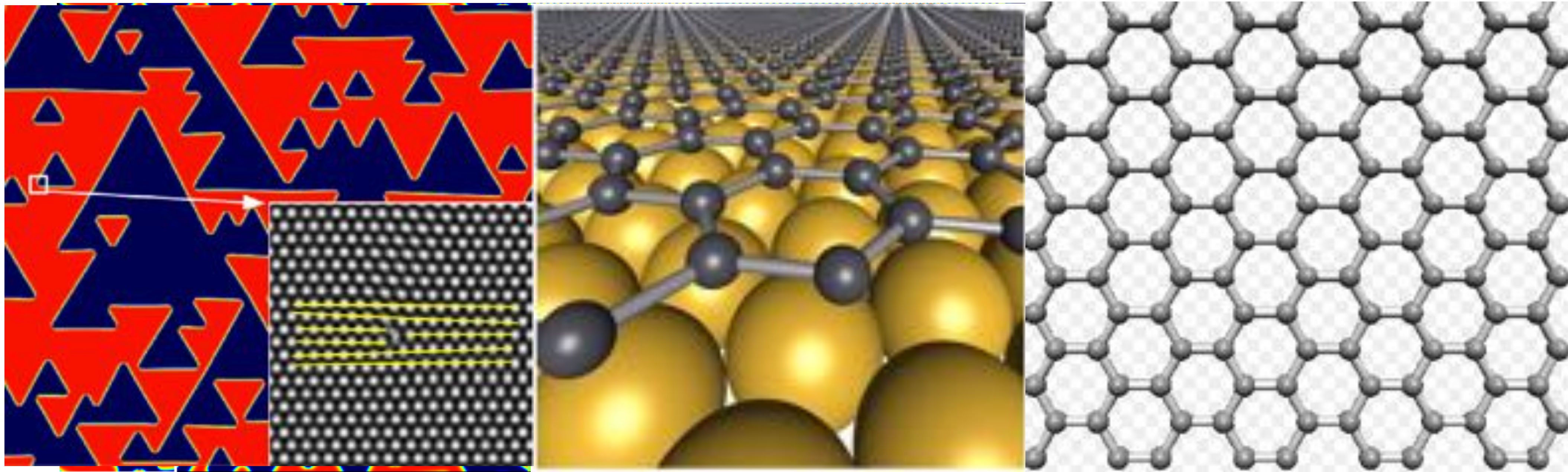


Multi-Scale Modeling of Graphene from Nano to Micron Scales

Tapio Ala-Nissilä

Department of Applied Physics at Aalto University School of Science, Finland, and
Department of Mathematical Sciences & Physics at Loughborough University, UK



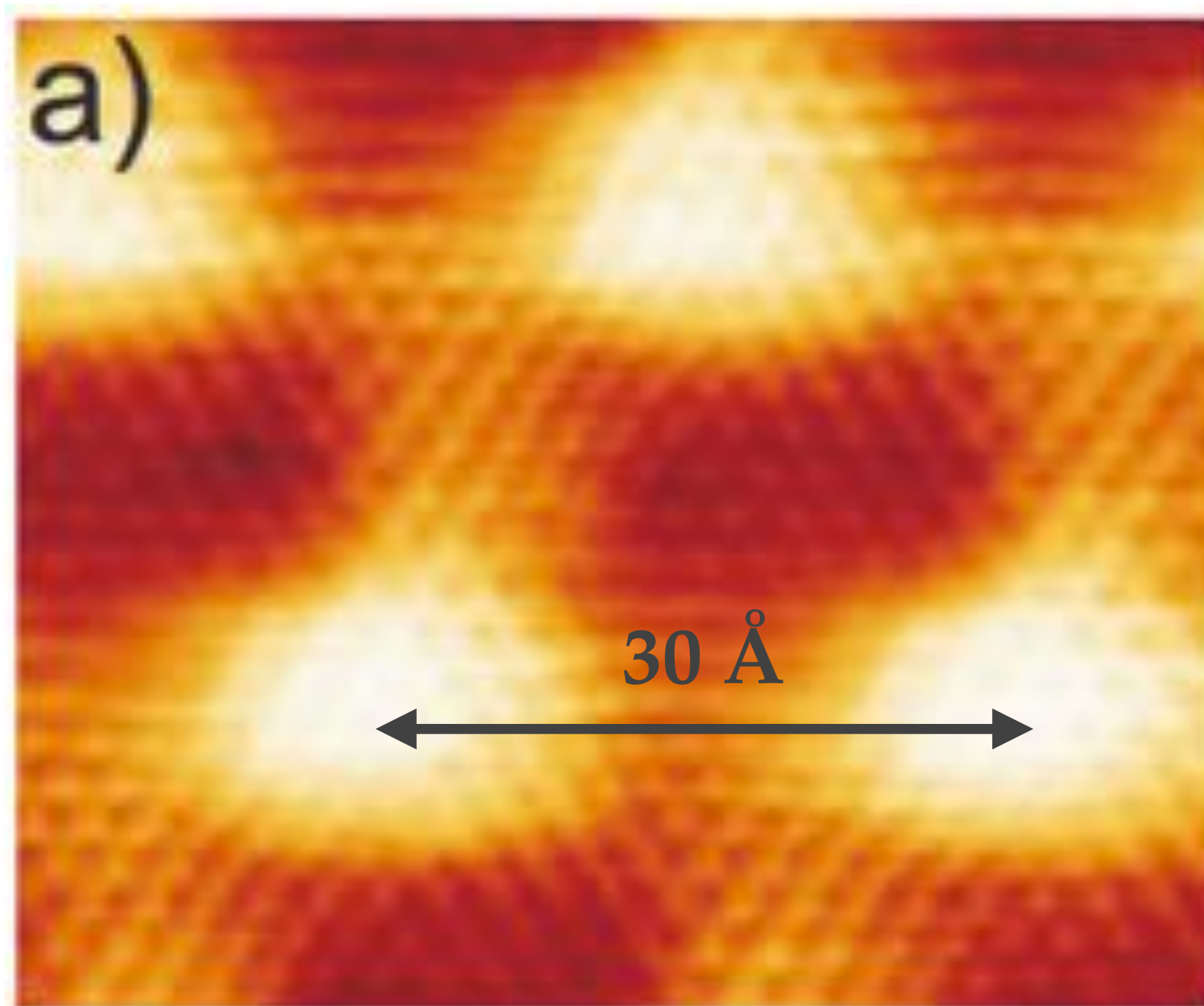
[K.R. Elder *et al.*, PRL (2012); PRB (2013); JCP (2016); P. Hirvonen *et al.*, PRB (2016); Sci. Rep. (2017); Z. Fan *et al.*, PRB (2017), Nano Lett. (2017); K. Azizi *et al.*, Carbon (2017)]

Outline of the Talk

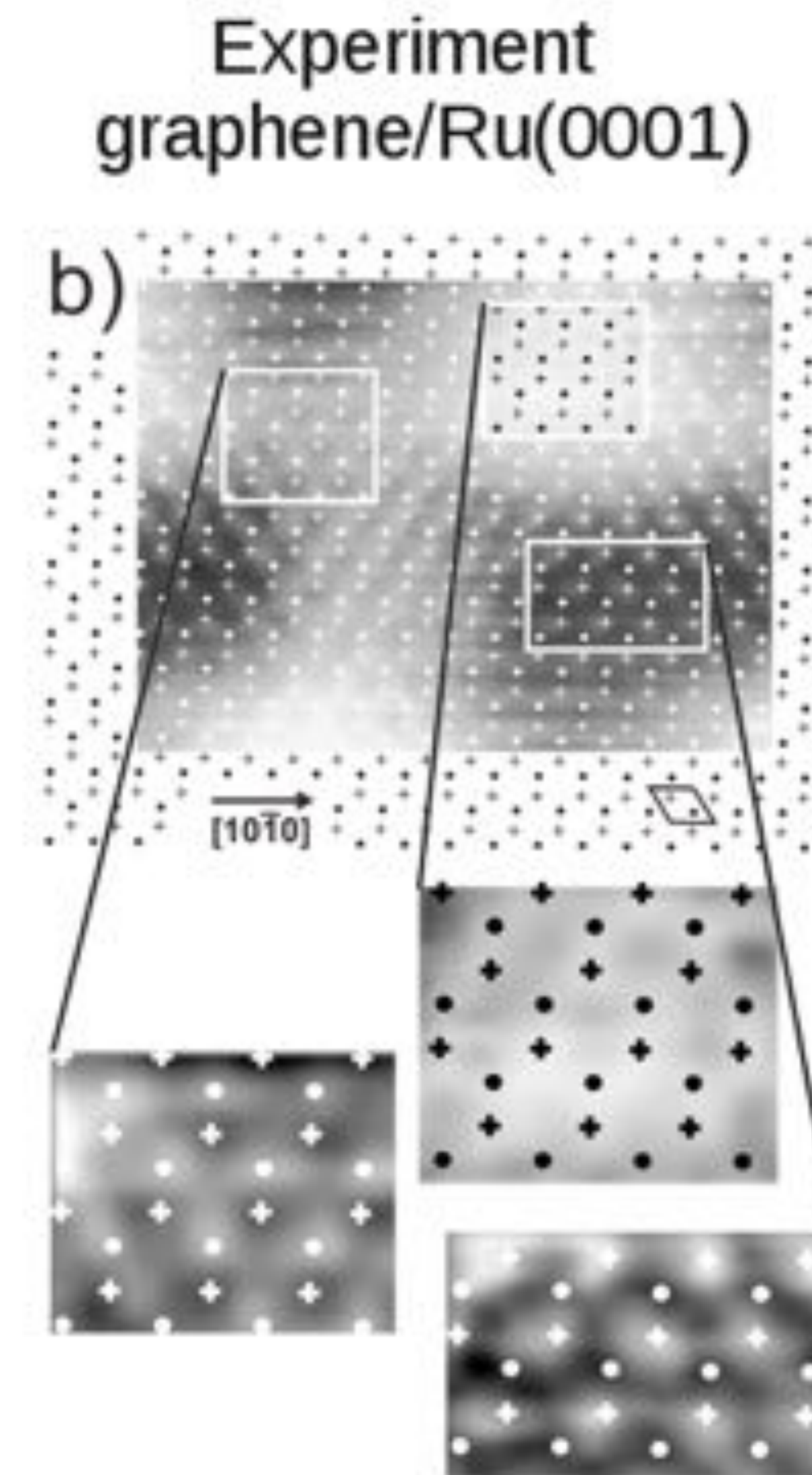
- ❖ Introduction to Graphene and Modeling Methods
- ❖ Phase Field Crystal Model
- ❖ Multi-Scale Modeling Strategy for Graphene
- ❖ Large Multigrain Flakes
- ❖ Heat Conduction in Graphene
- ❖ Summary and Conclusions

Introduction

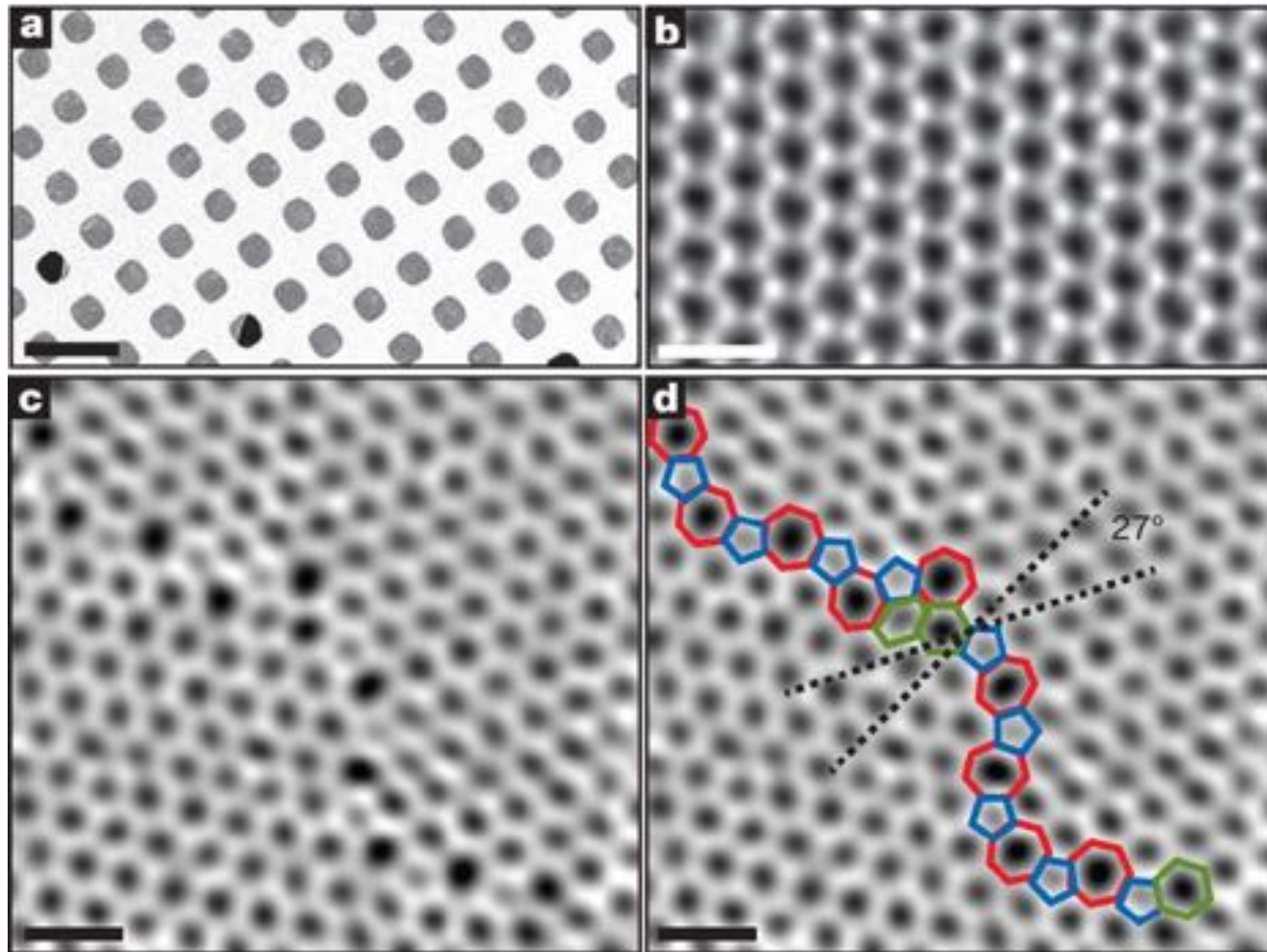
- ❖ Graphene is often grown on metal surfaces to achieve epitaxial configurations (usually under tensile stress)



[S. Marchini *et al.*, PRB **76**, 075429 (2006)]

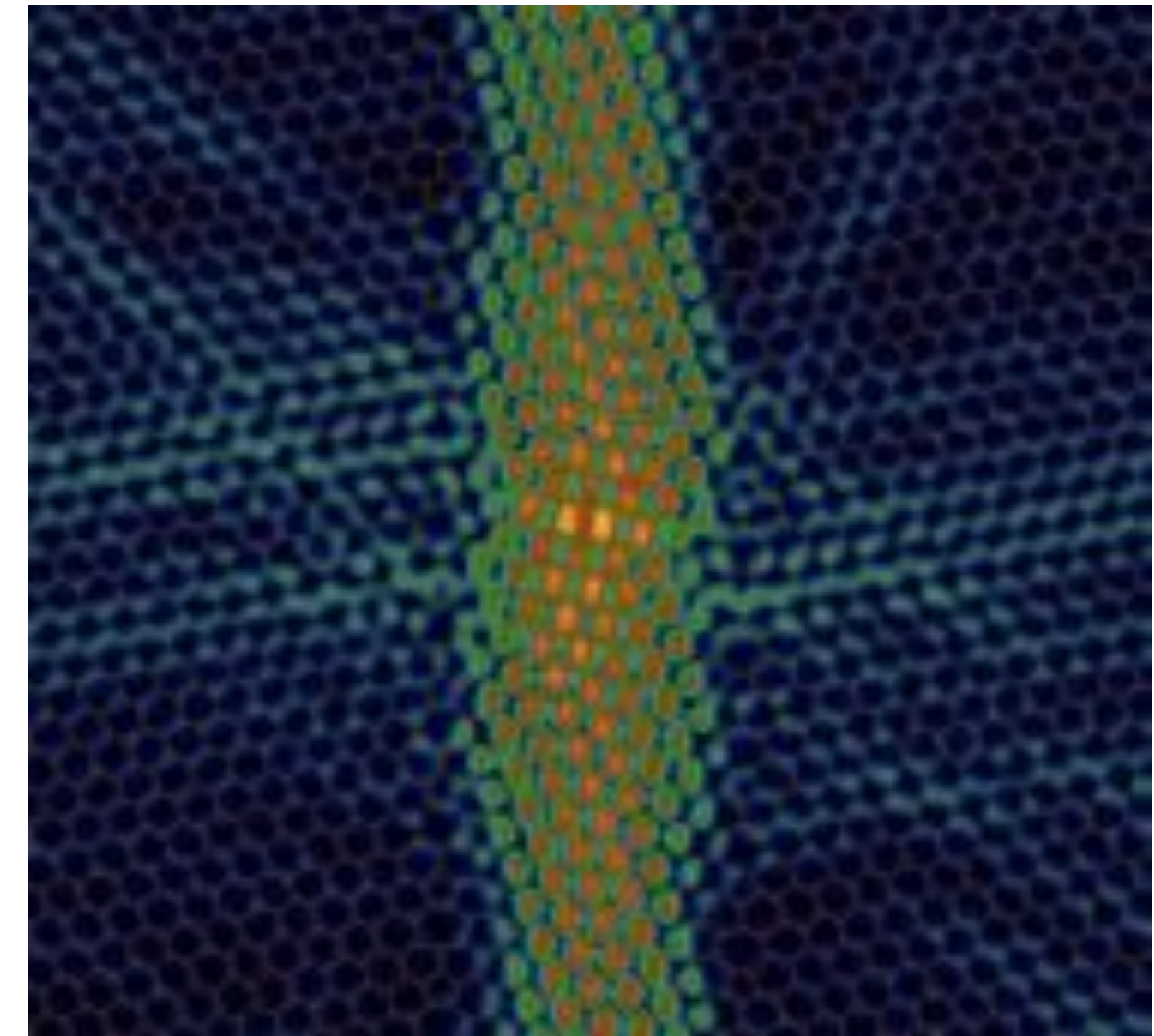
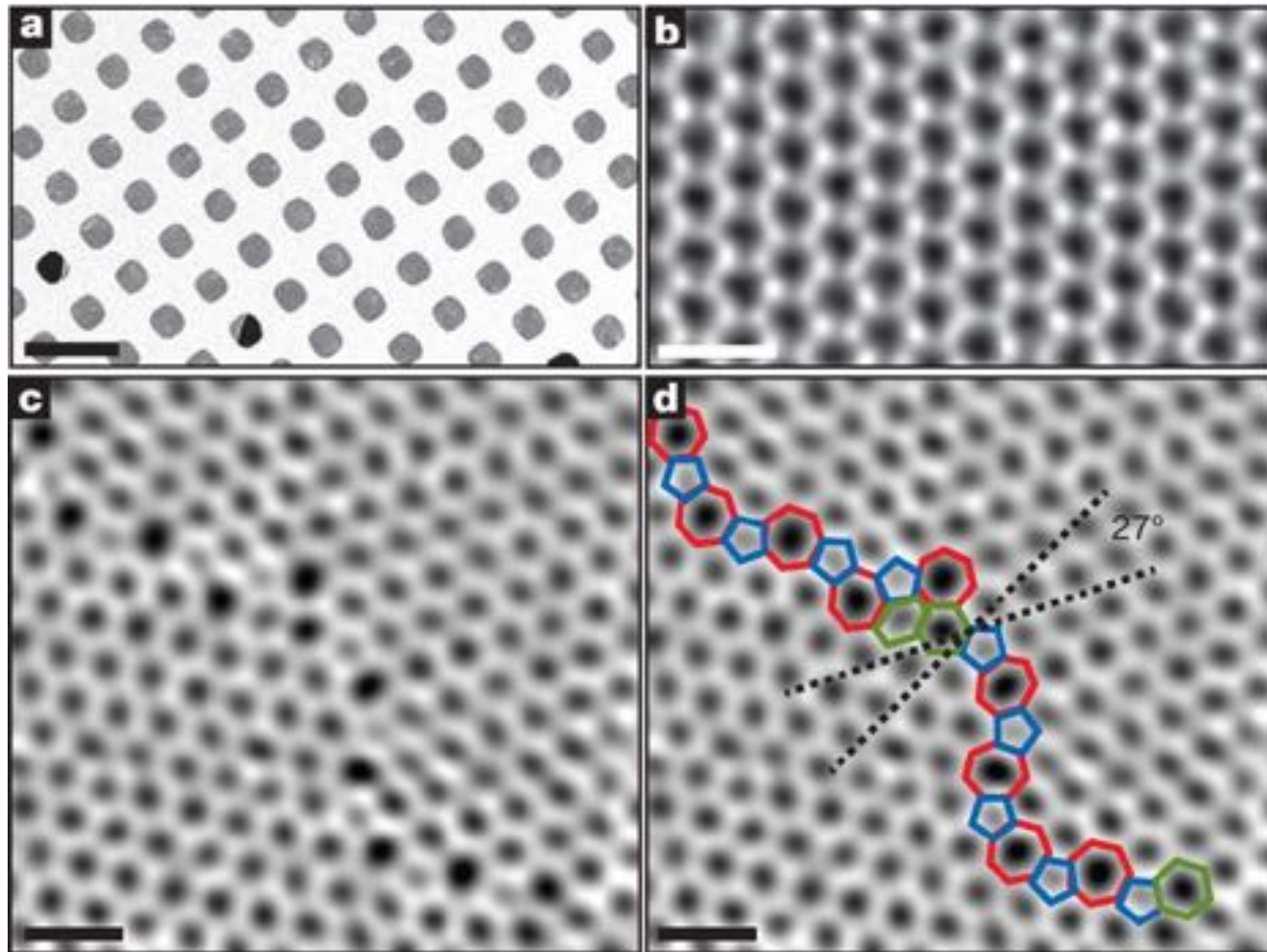


Introduction



High resolution electron microscopy of graphene flakes
[Huang *et al.*, Nature **469**, 389 (2011)]

Introduction



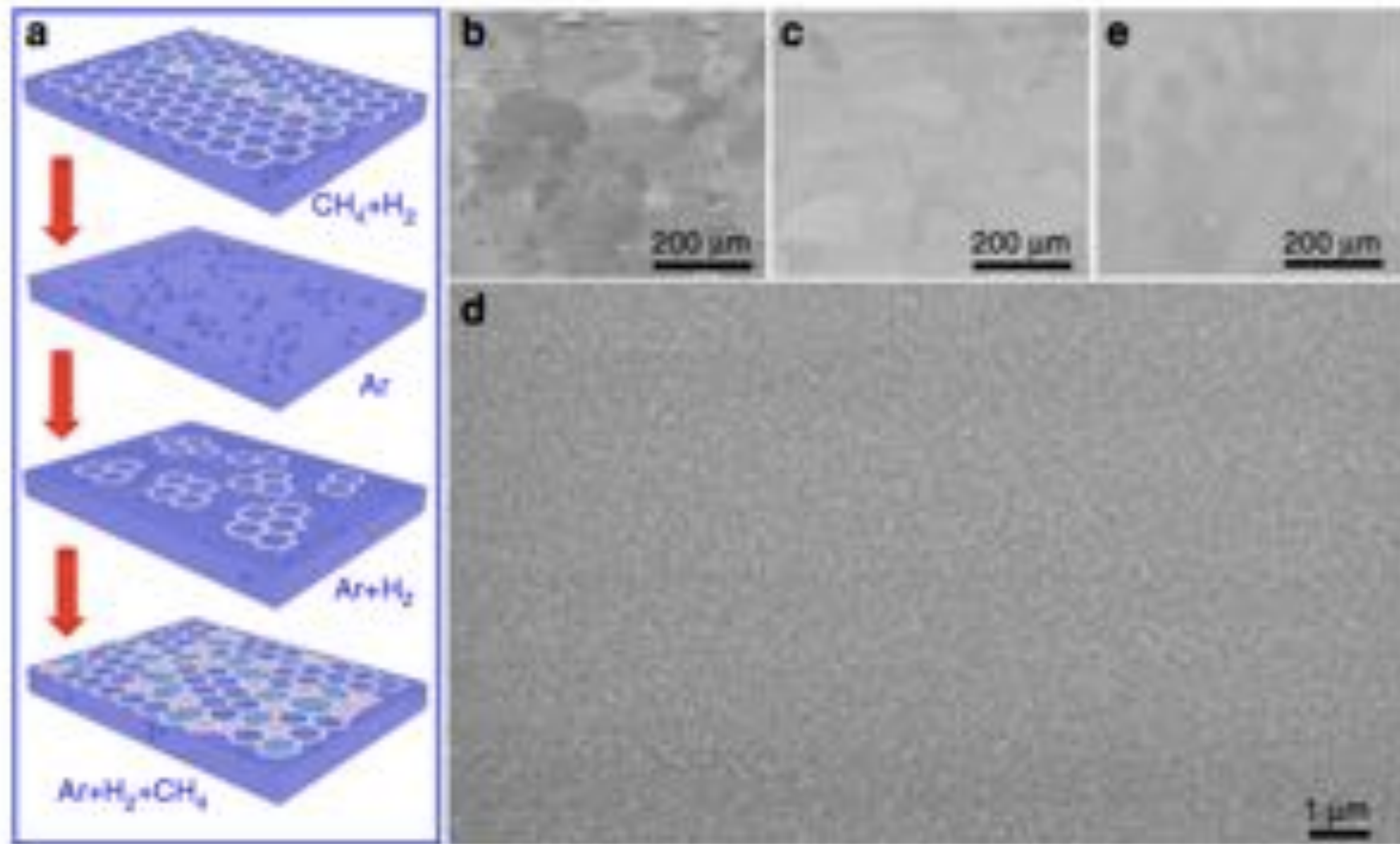
Photonic wave guide between grain boundaries

[Mark *et al.*, J. Nanophoton. **6**, 061718 (2012)]

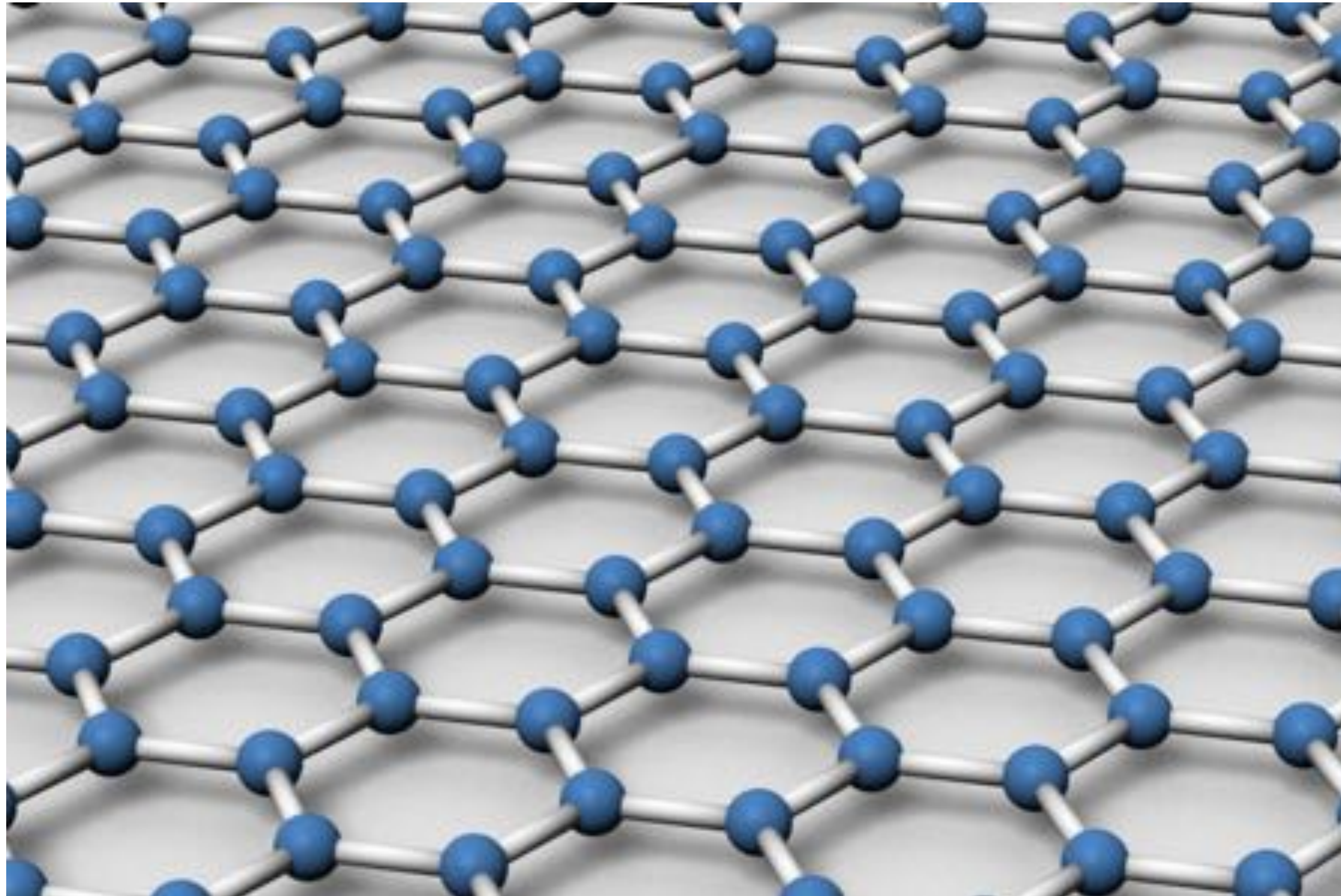
High resolution electron microscopy of graphene flakes
[Huang *et al.*, Nature **469**, 389 (2011)]

Introduction

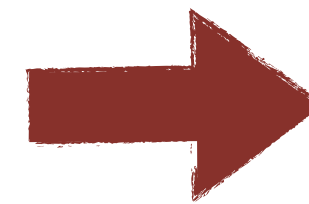
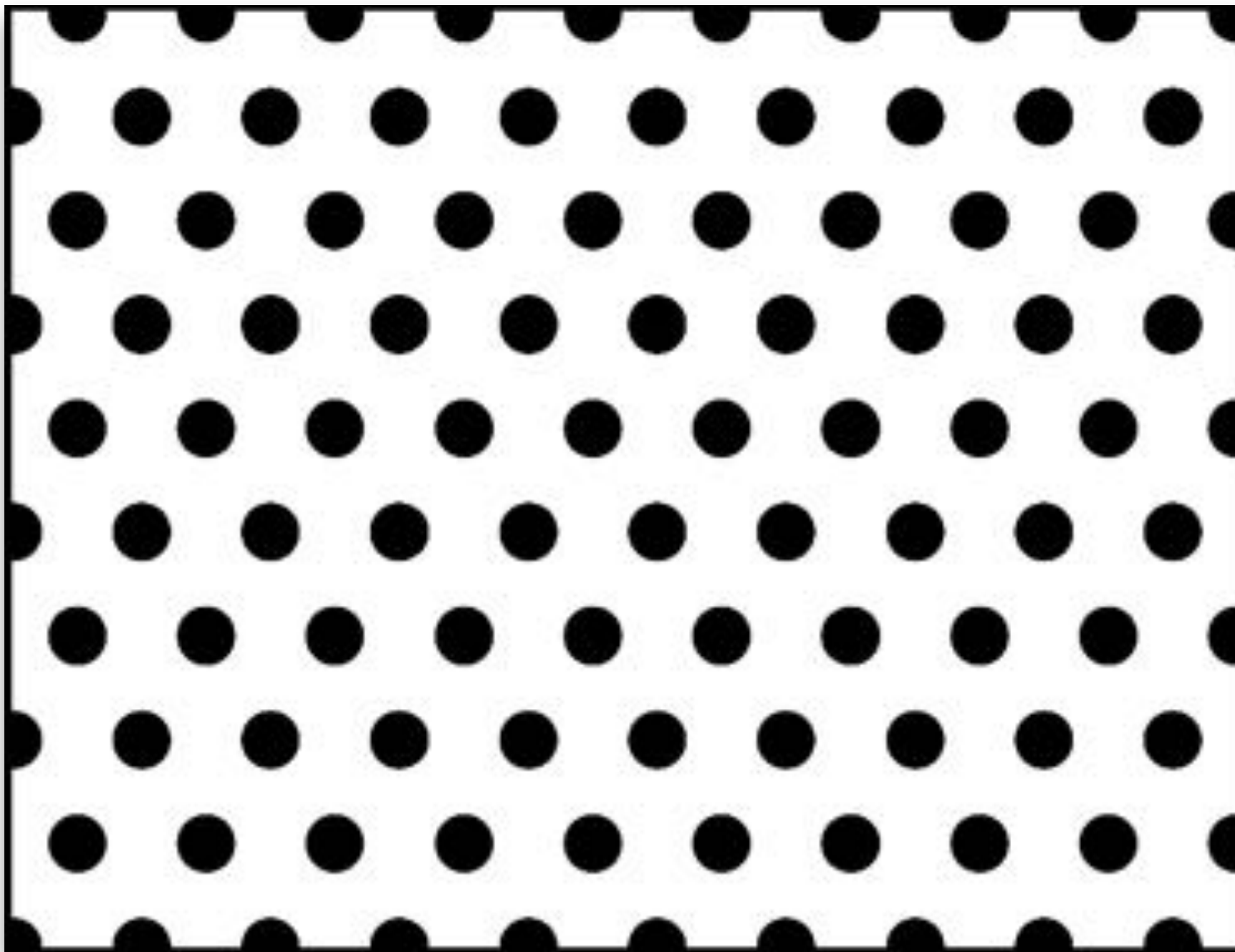
- ❖ Controlled growth of grains can now be achieved with modified chemical vapour deposition



Modeling Graphene



Phase Field Crystal (PFC) Model¹



Atomistic description: $n(\mathbf{r}) = \sum_j \delta(\mathbf{r} - \mathbf{r}_j)$

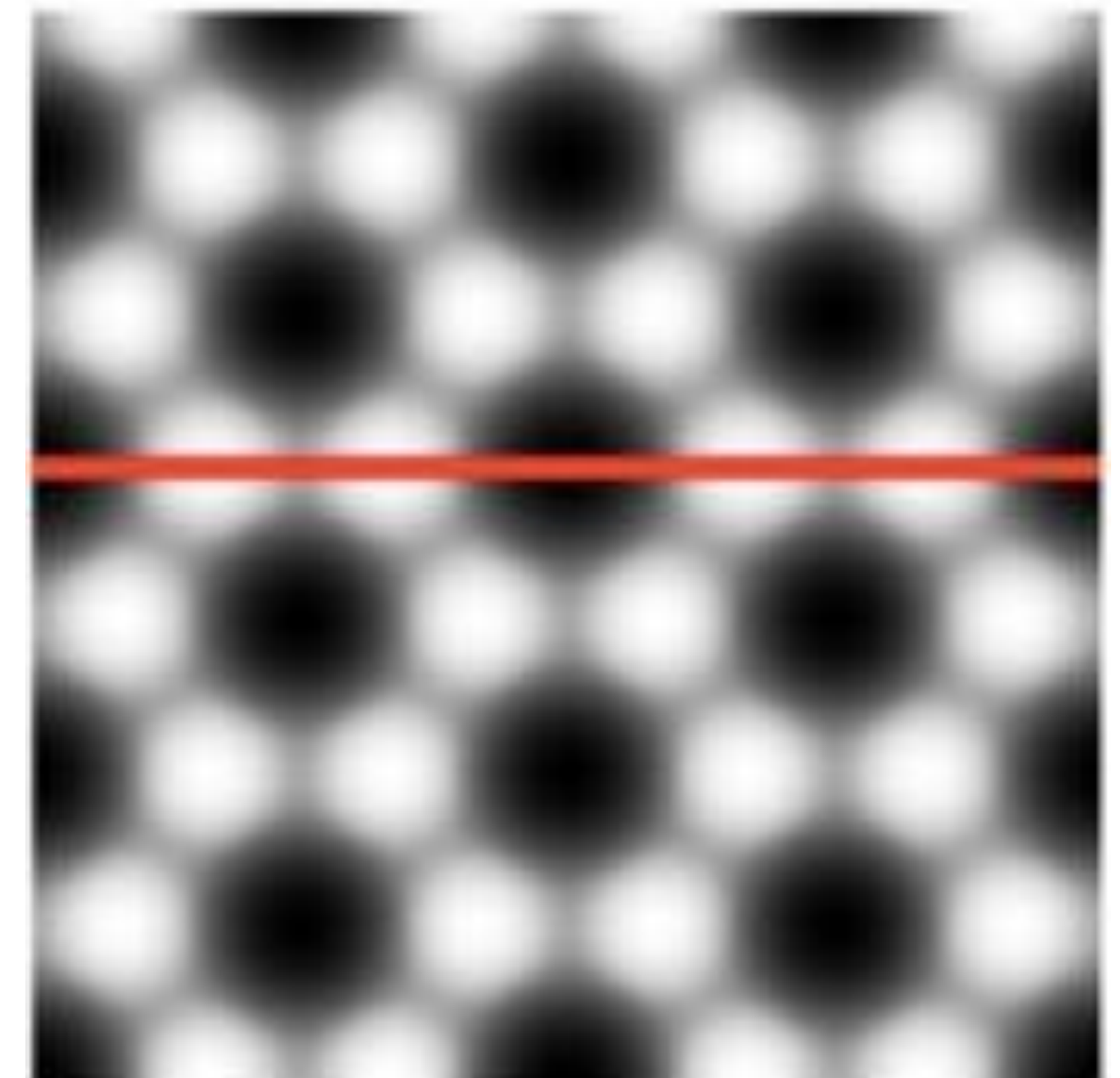
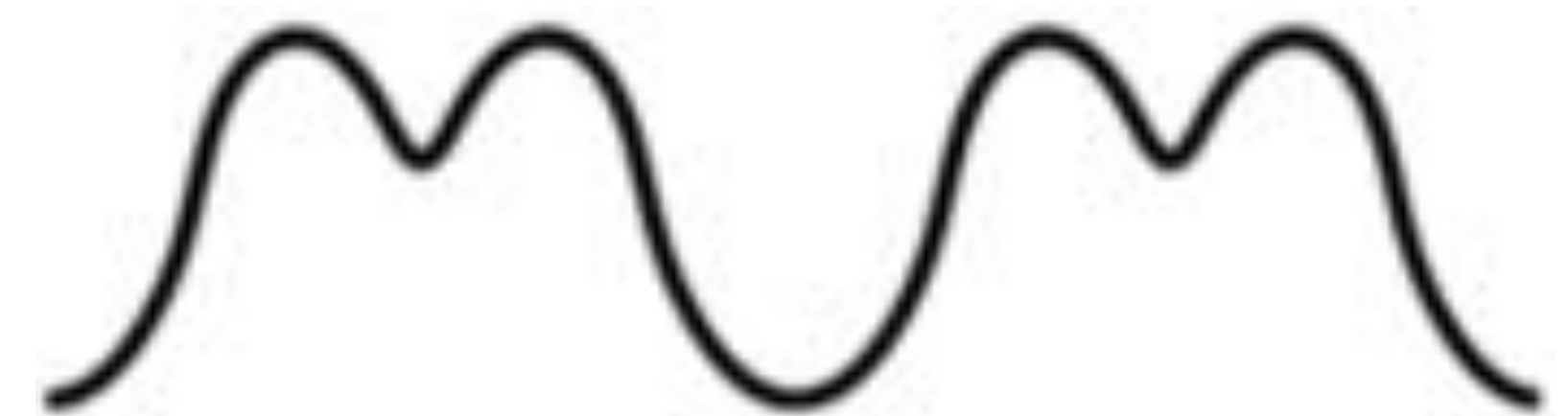
Statistical description: $n(\mathbf{r}) = \left\langle \sum_j \delta(\mathbf{r} - \mathbf{r}_j) \right\rangle$

¹K. Elder *et al.* PRL 88, 245701 (2002)

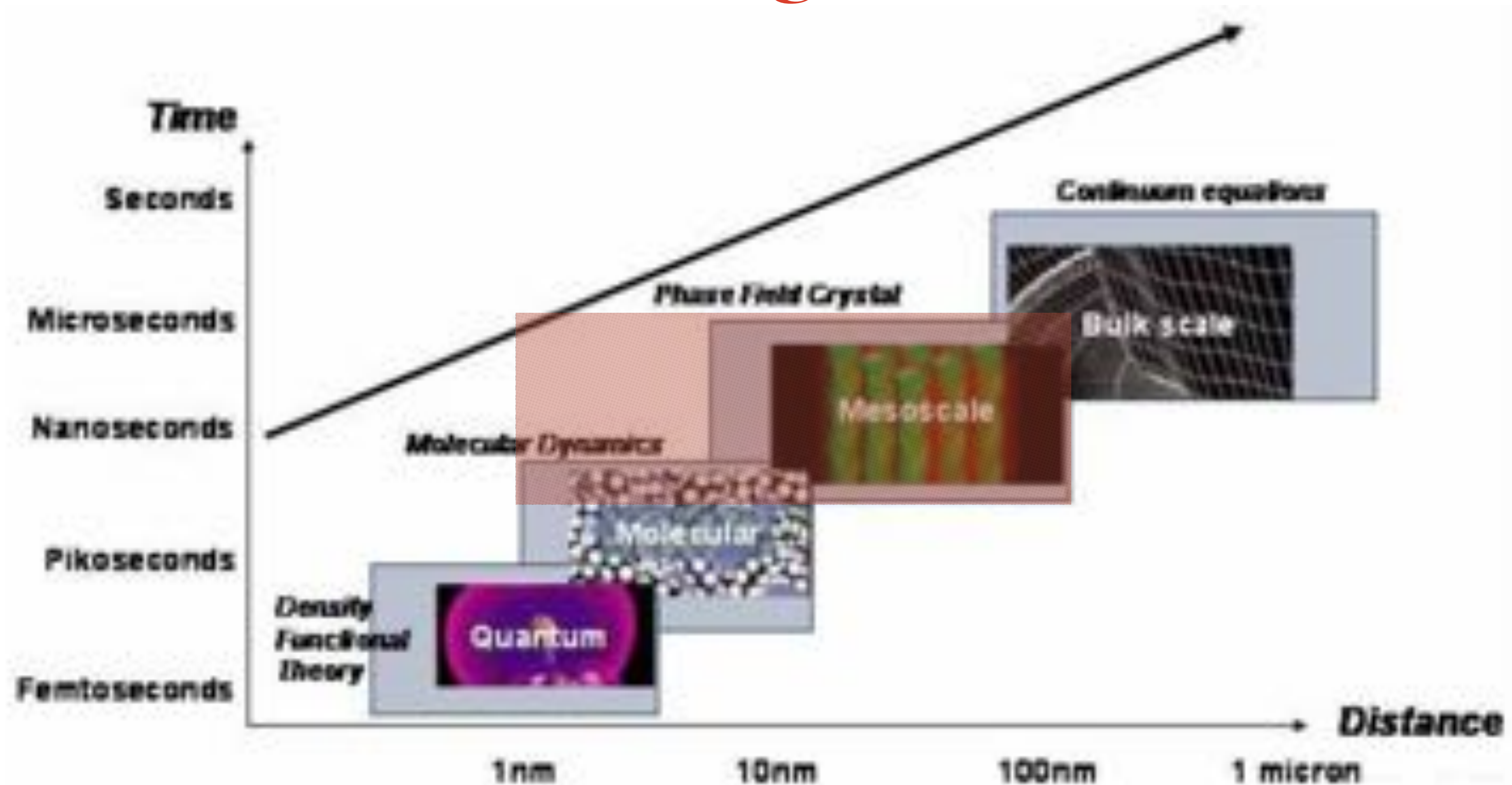
PFC Free Energy

$$F[n(\mathbf{r}, t)] = \int d\mathbf{r} \left[\frac{\Delta B}{2} n^2 + \frac{B^x}{2} n(1 + \nabla^2)^2 n - \frac{\tau}{3} n^3 + \frac{\nu}{4} n^4 \right]$$

❖ *Graphene (honeycomb) ground state*



Modeling Scales



PFC Free Energy

$$F [n(\mathbf{r}, t)] = \int d\mathbf{r} \left[\frac{\Delta B}{2} n^2 + \frac{B^x}{2} n(1 + \nabla^2)^2 n - \frac{\tau}{3} n^3 + \frac{\nu}{4} n^4 \right]$$

- ❖ Describes the energy of the system as functional of the atomistic number density field - *liquid and crystalline ground states (and coexistence)*
- ❖ Contains *topological defects and elastic excitations*
- ❖ Can be derived from classical DFT [Elder & Grant (2004), Jaatinen & T.A-N. (2010)]
- ❖ Usually coupled to dissipative dynamics in time

$$\frac{\partial n}{\partial t} = - \frac{\delta F[n]}{\delta n}$$

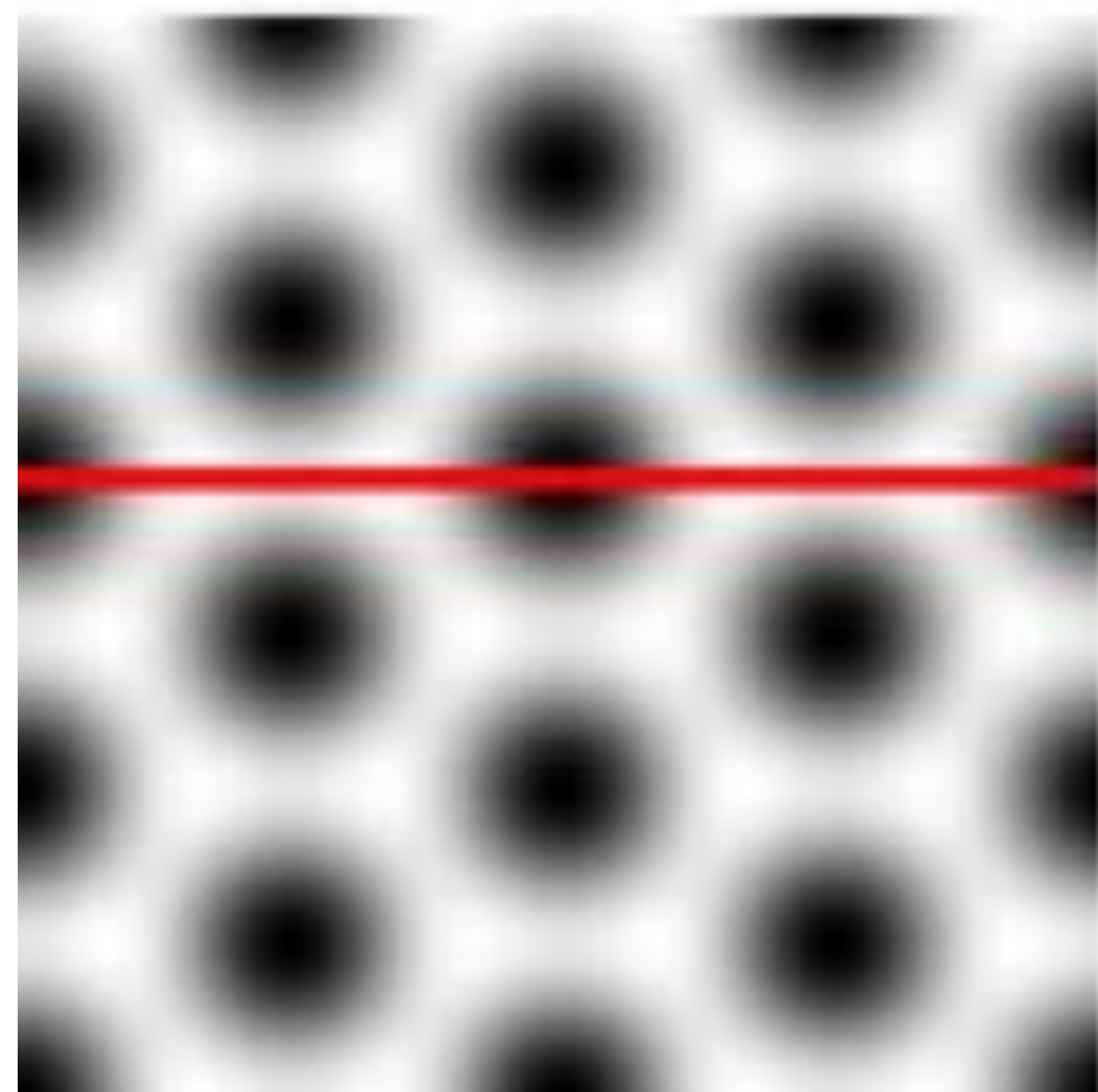
Multi-Scale Modeling Strategy for Graphene

- ❖ Use PFC to generate 2D grain boundary configurations
- ❖ Input to all-electron QM-DFT calculations for grain boundary energy and use these to fix energy scale in PFC
- ❖ Generate large-scale, multi-grain PFC samples as input to MD to relax for further calculations (e.g. **heat conduction** and electric conductivity)

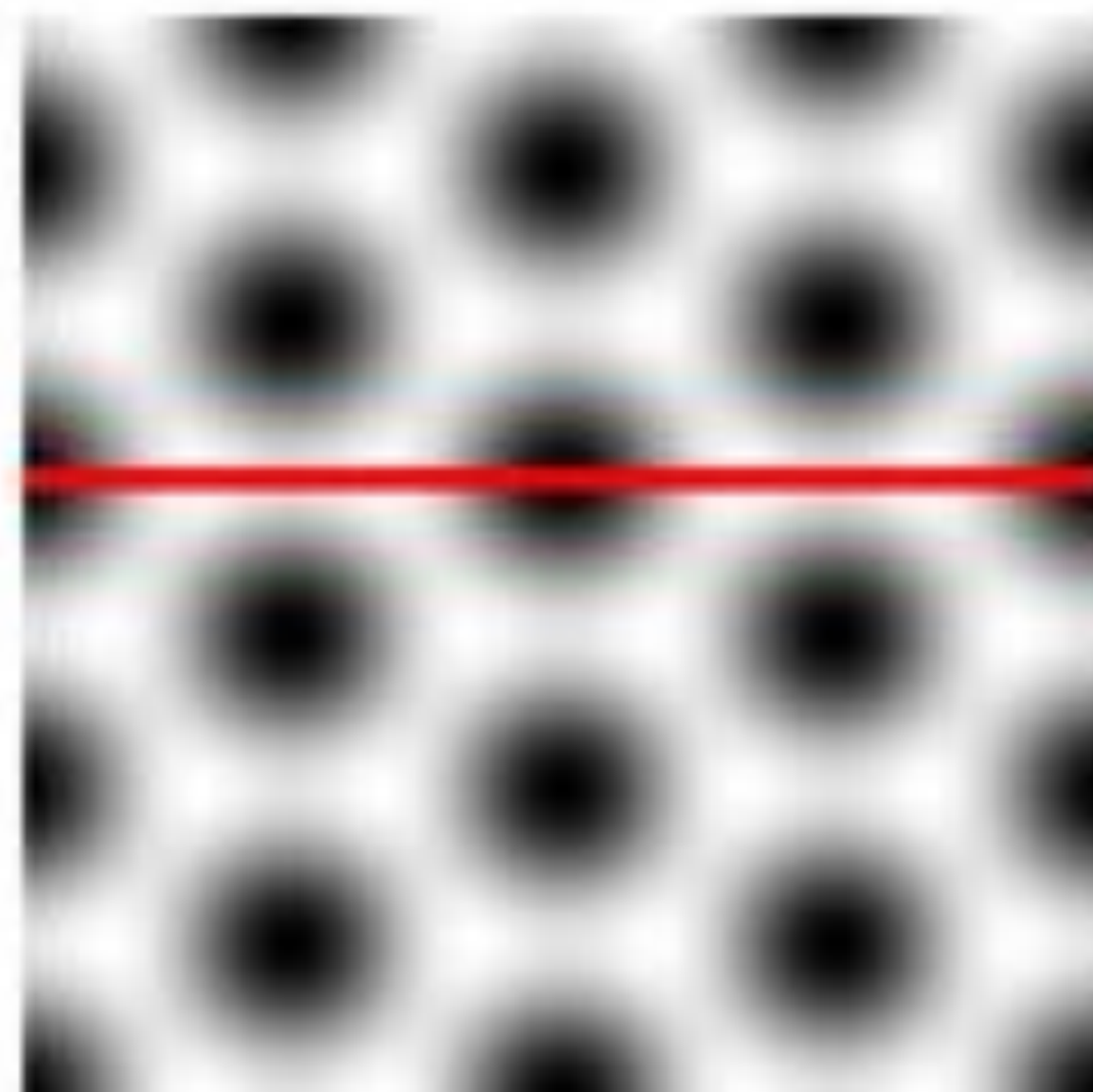
Methodology III: 2D PFC Models

- ❖ **PFC1**: Standard PFC (412 - 41 600 atoms)
- ❖ **APFC**: Amplitude expansion of PFC1 (1 140 - 5 900 000 atoms)
- ❖ **PFC3**: Three-mode PFC model (412 - 41 600 atoms)
- ❖ **XPFC**: PFC model with two and three-body interactions (412 - 166 400 atoms) [M. Seymour and N. Provatas, PRB 93, 035447 (2016)]

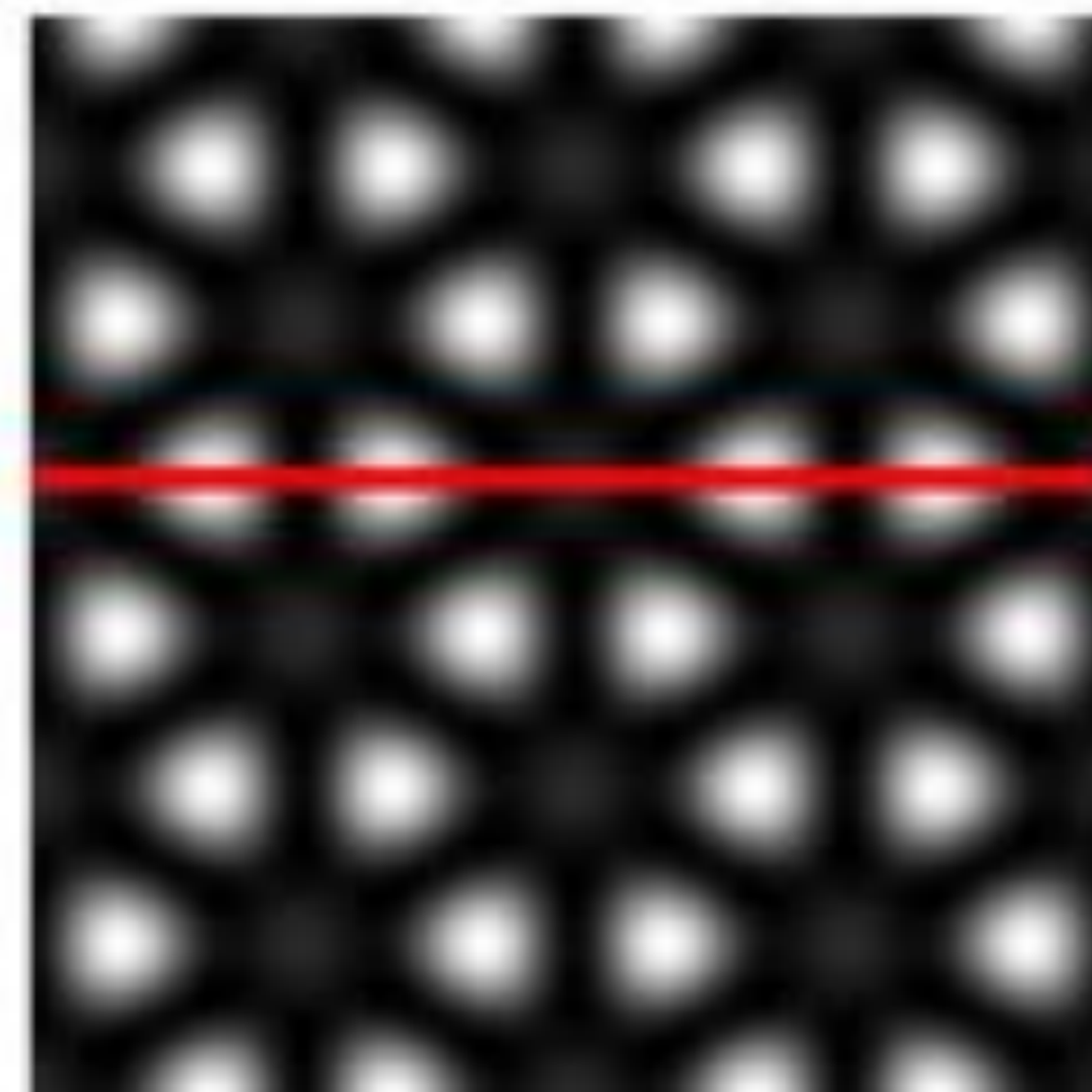
PFC Density Fields



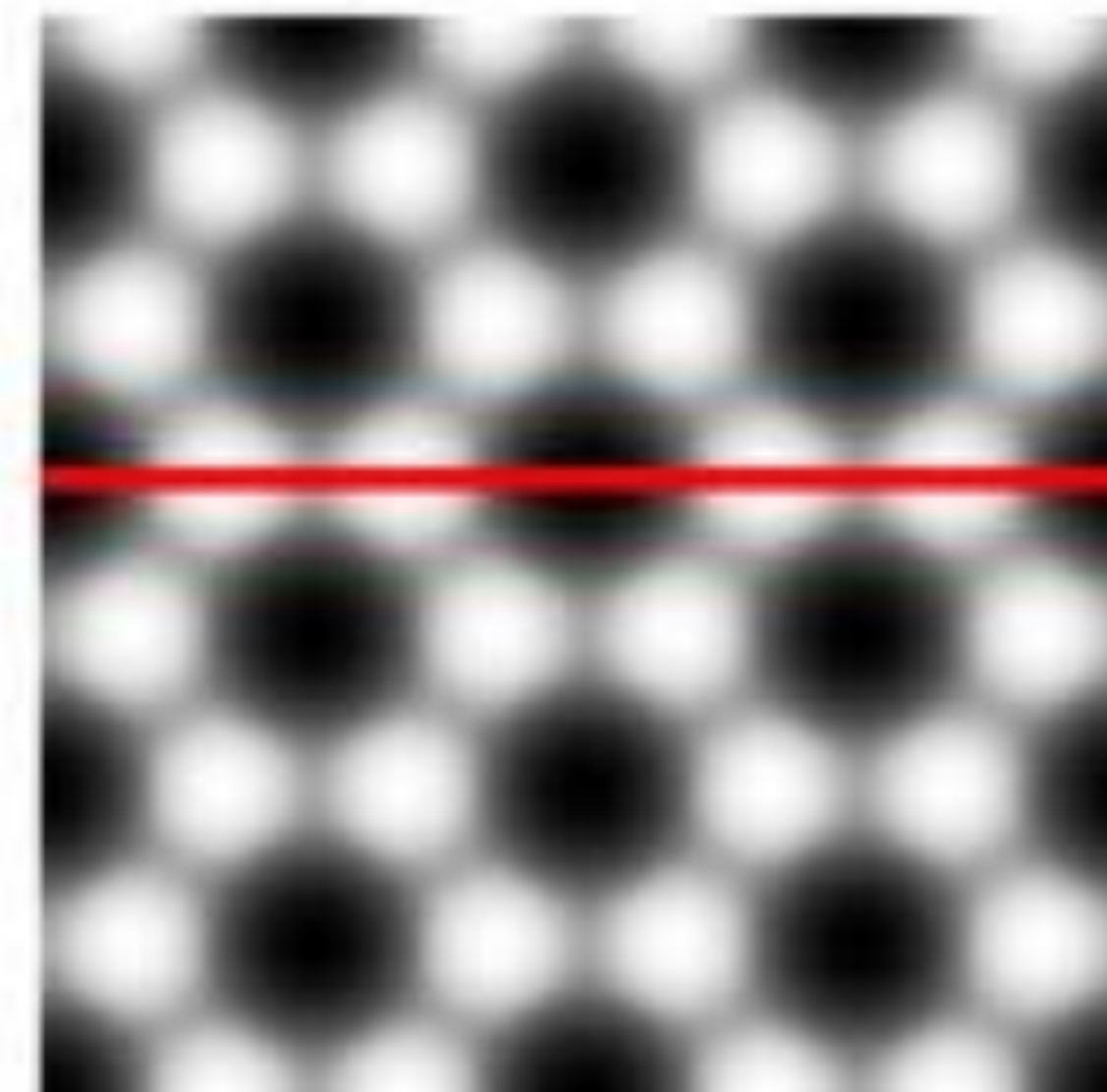
PFC1



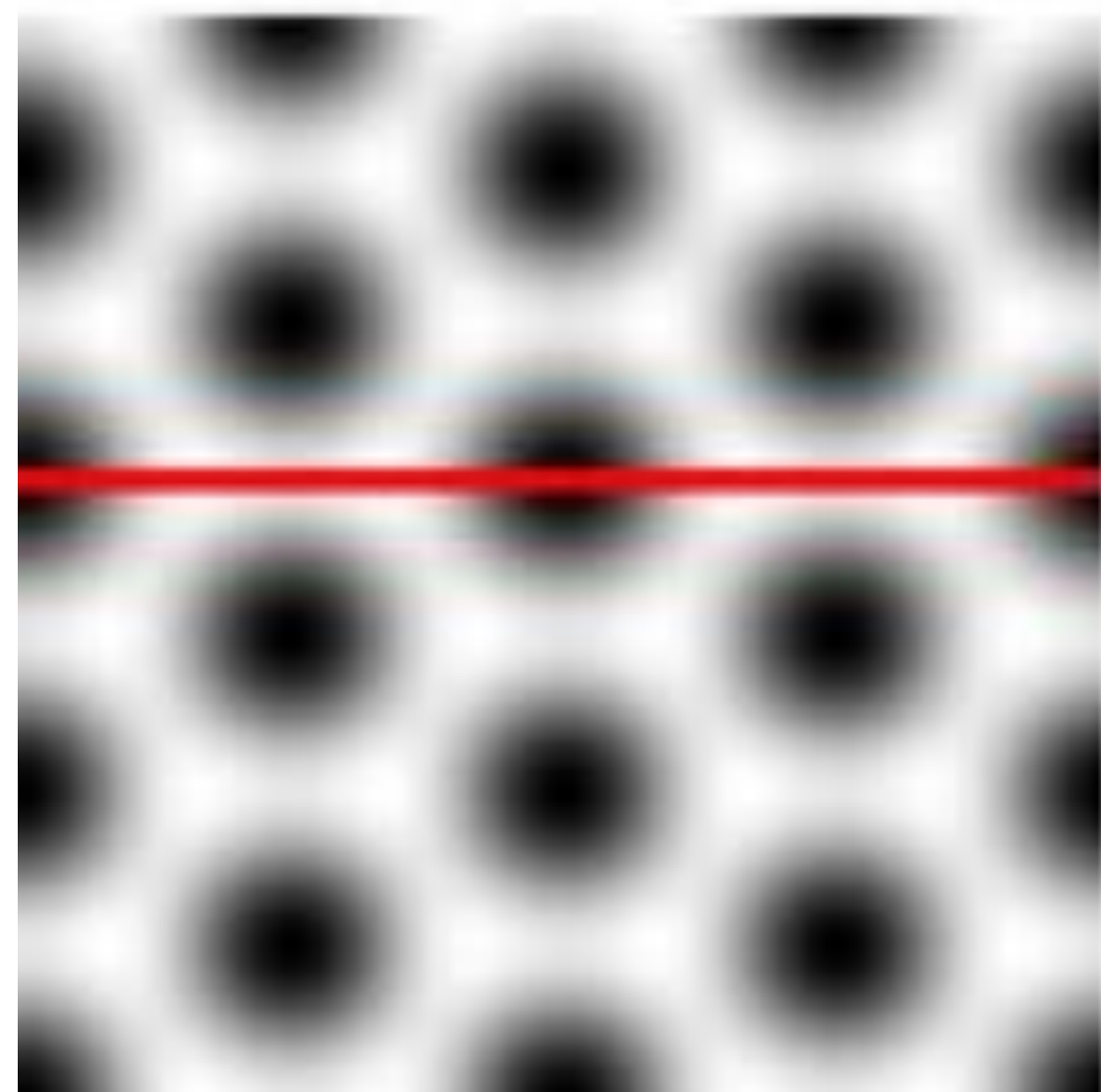
APFC



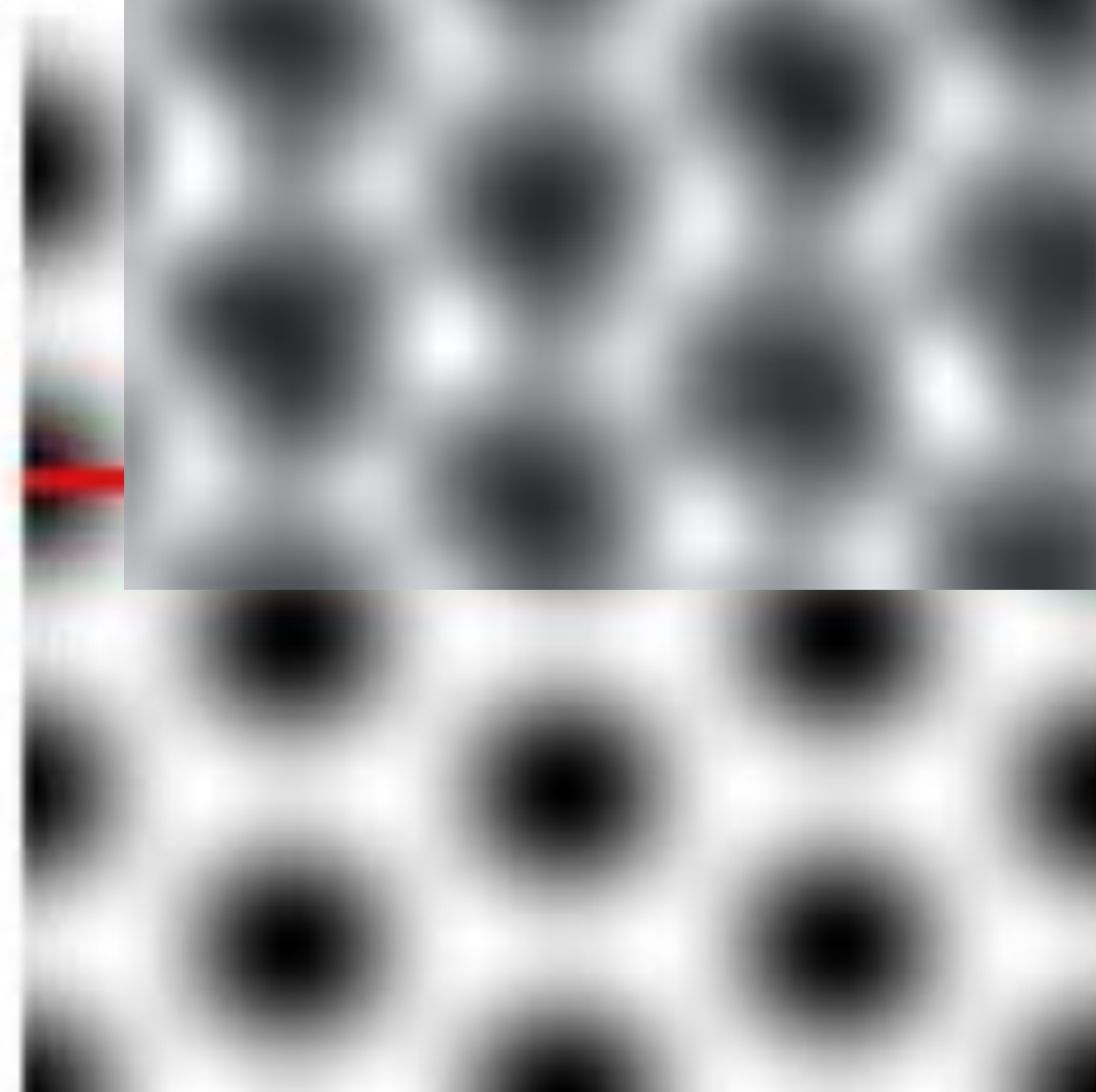
PFC3



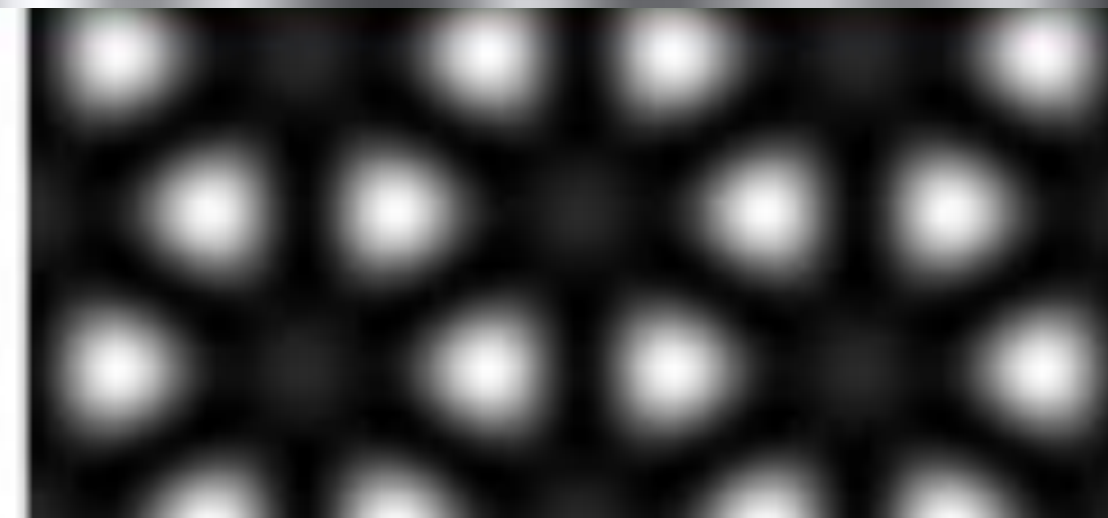
XPFC



PFC1



APFC



PFC3

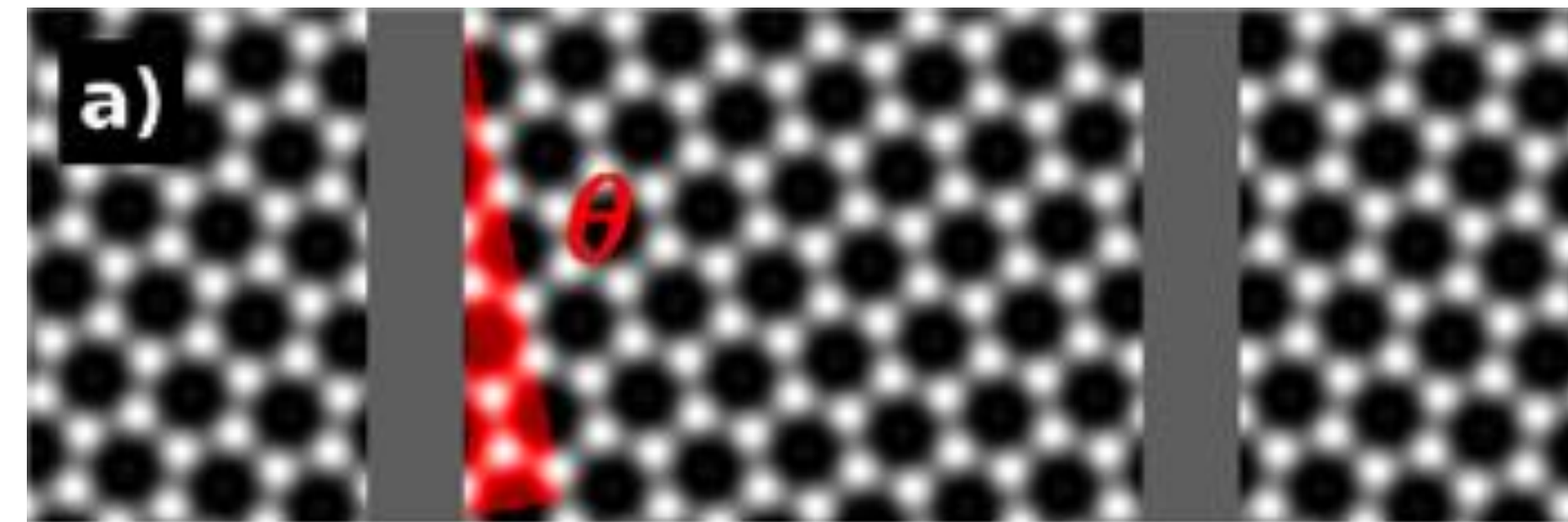


XPFC



Step 1: Creating PFC Grain Boundaries

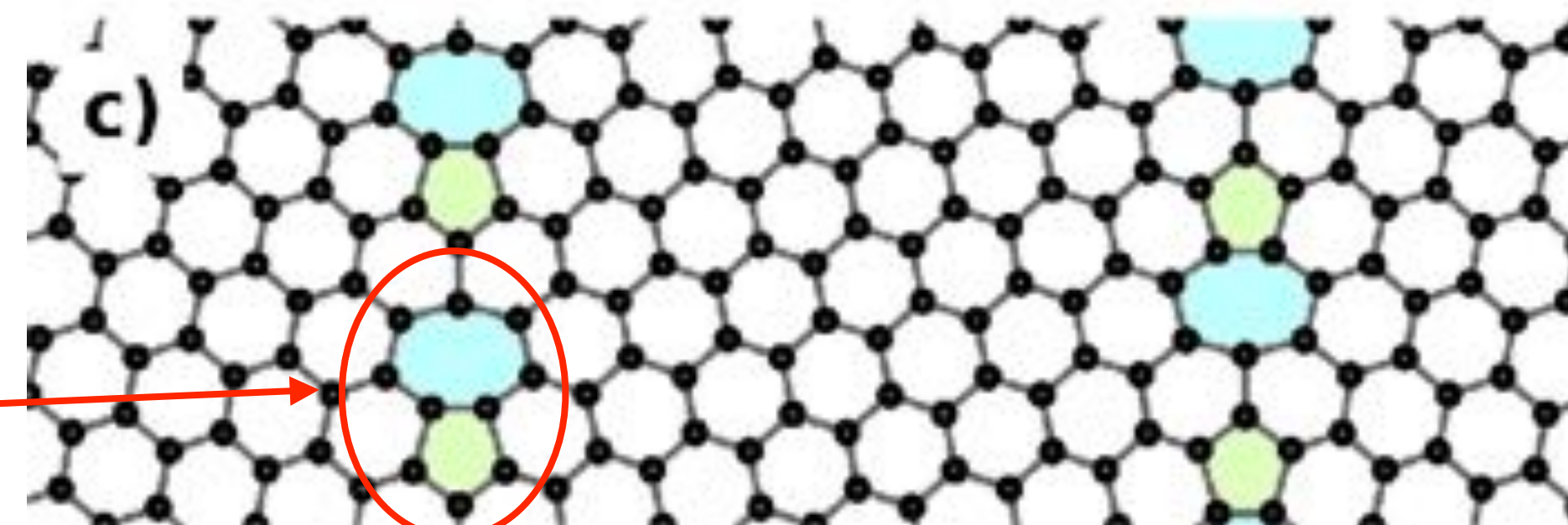
- ❖ Bicrystalline layout (with two GBs) and periodic boundaries
- ❖ Finite size effects eliminated (system sizes > 10 nm)
- ❖ Atomic positions used as input for QM-DFT and MD relaxation



APFC



PFC3



Atomic
positions

5|7

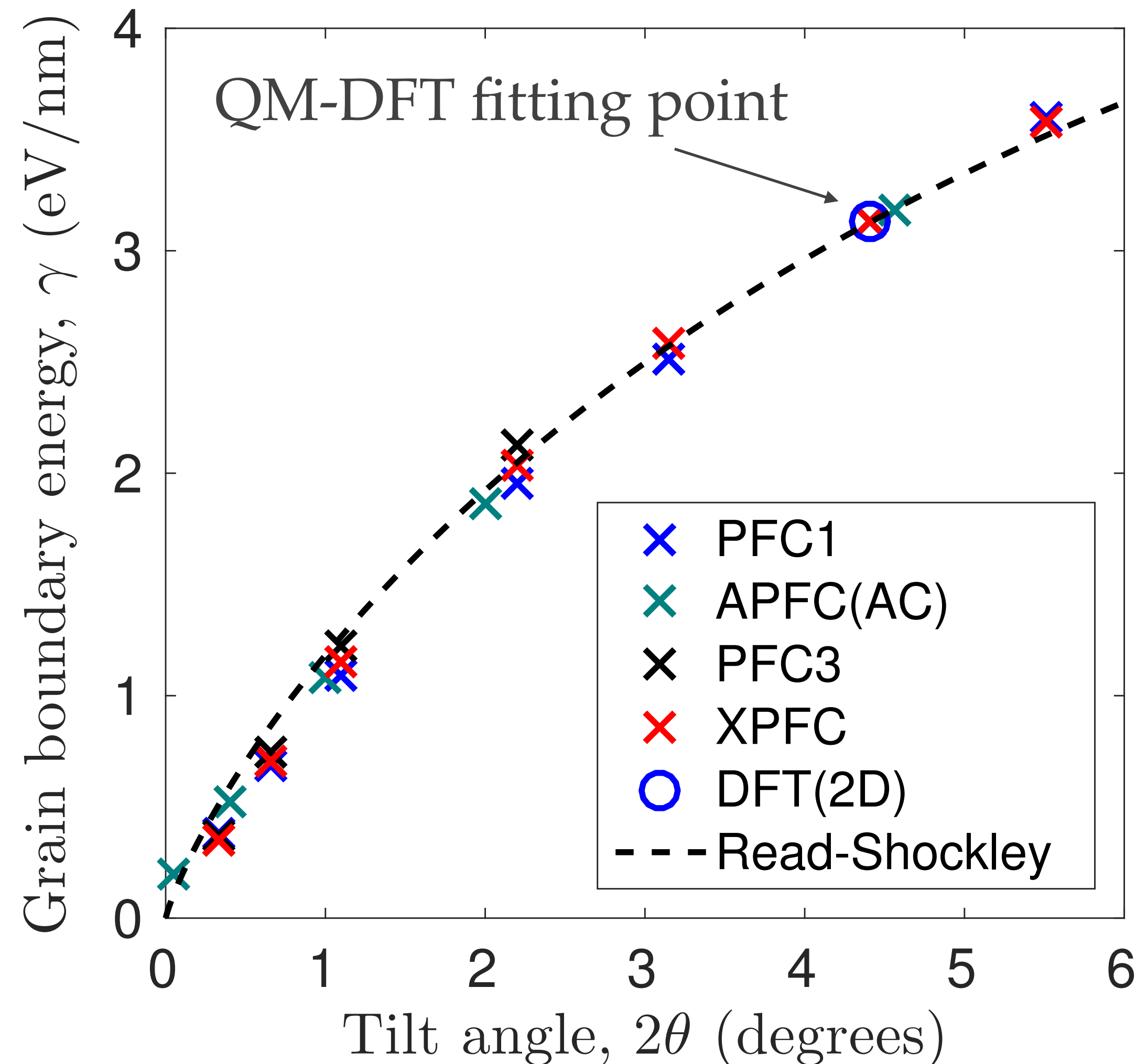
x

4 nm

Step 2: Fitting to QM-DFT

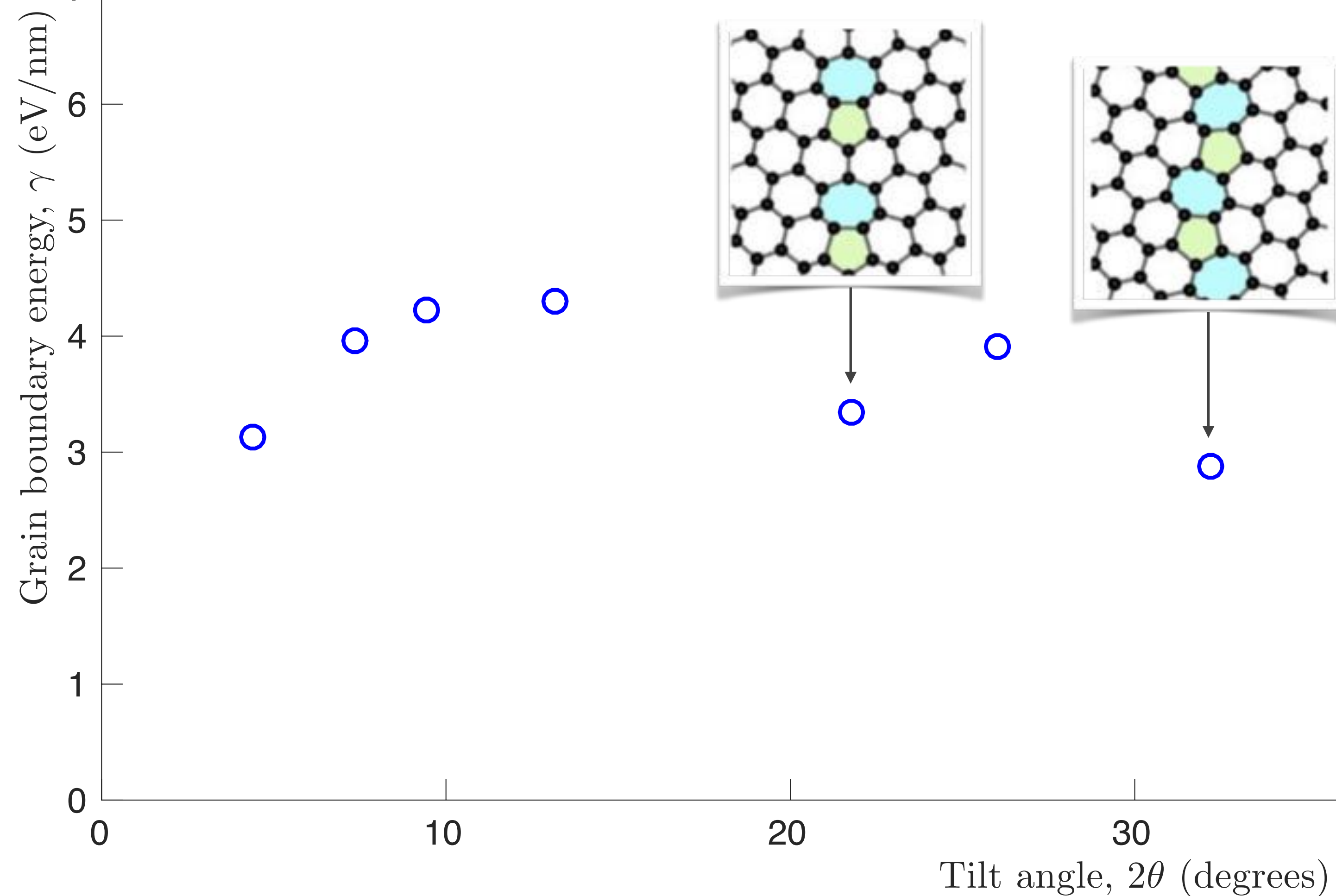
- ❖ Small-angle GB limit $2\theta \approx 4.6^\circ$ used to set energy scales in PFC models
- ❖ Read-Shockley equation in small GB angle limit:

$$\gamma = \frac{bY_{2D}}{8\pi} \theta \left(\frac{3}{2} - \ln(2\pi\theta) \right)$$



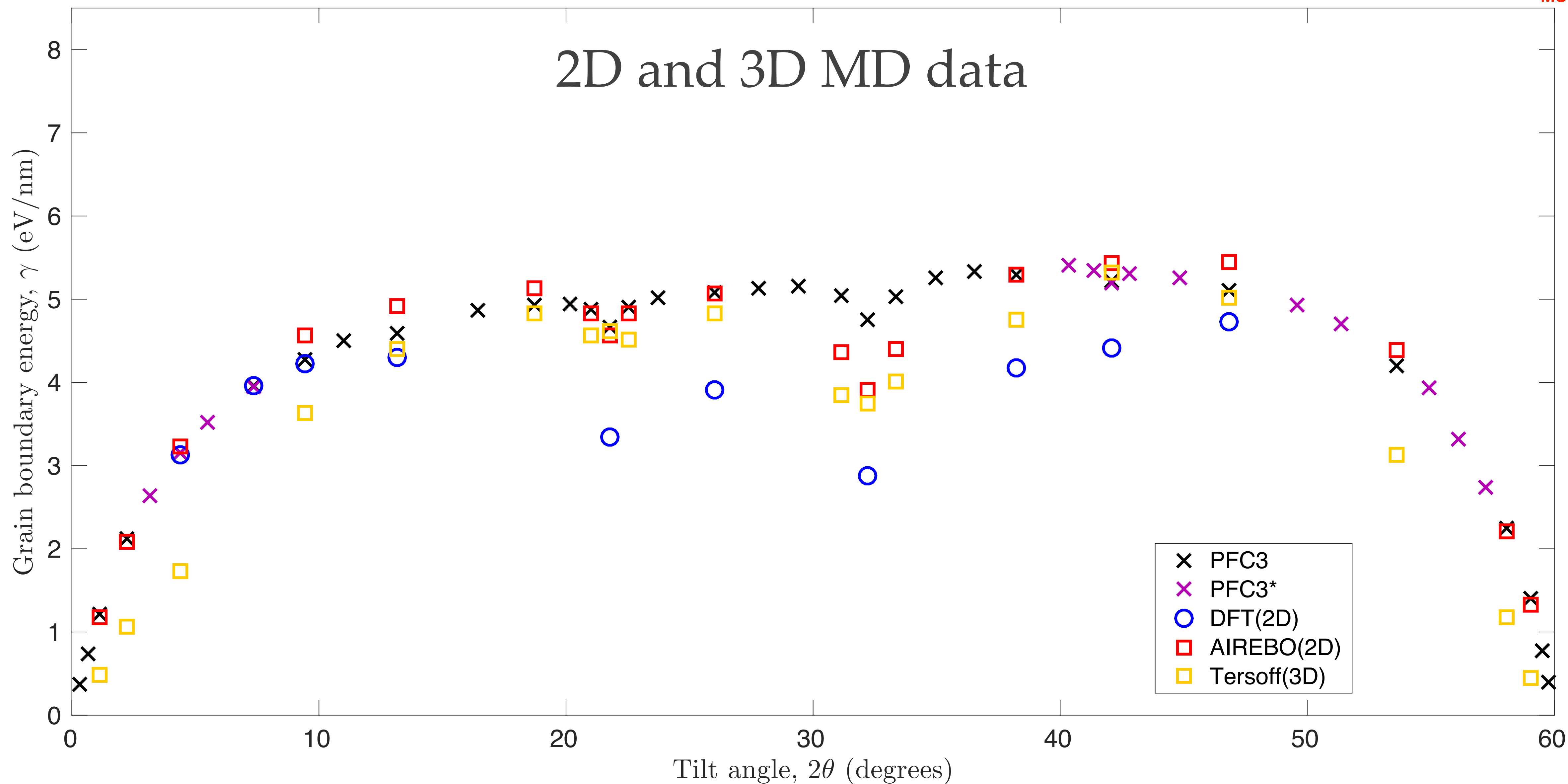
Step 3: Grain Boundary Energies

2D QM-DFT as benchmark

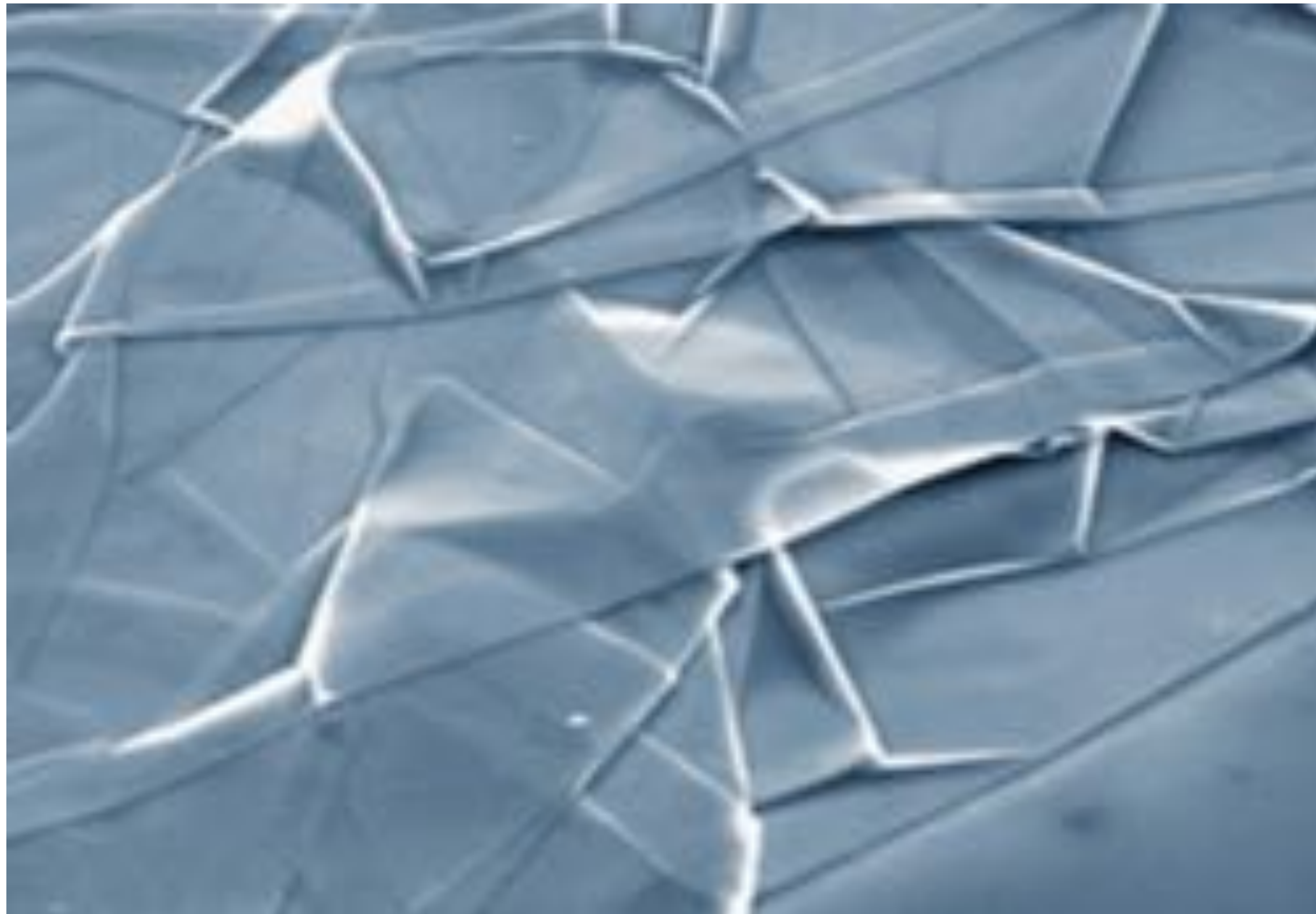


○ DFT(2D)

2D and 3D MD data

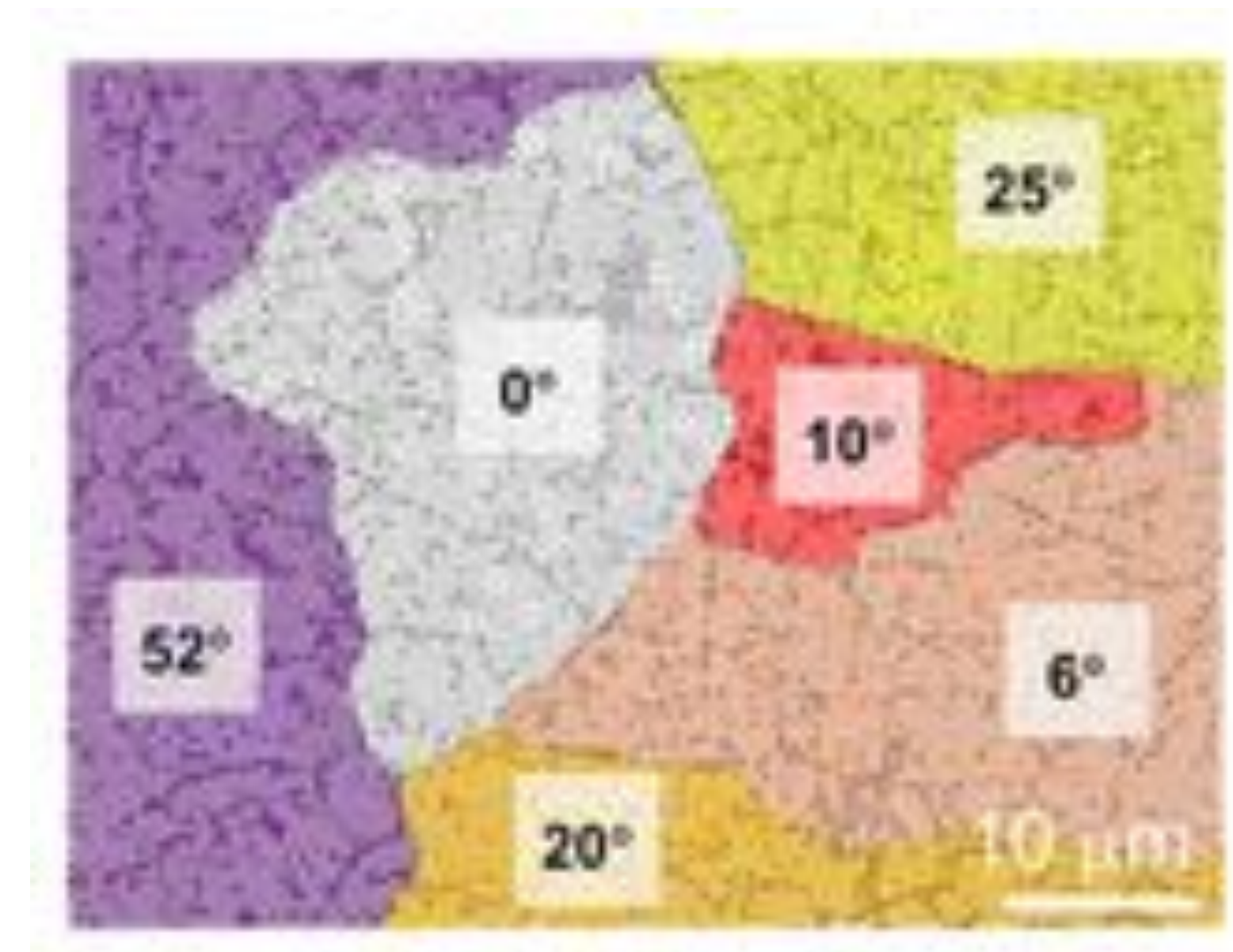


Large Multigrain Flakes



Large Multigrain Flakes

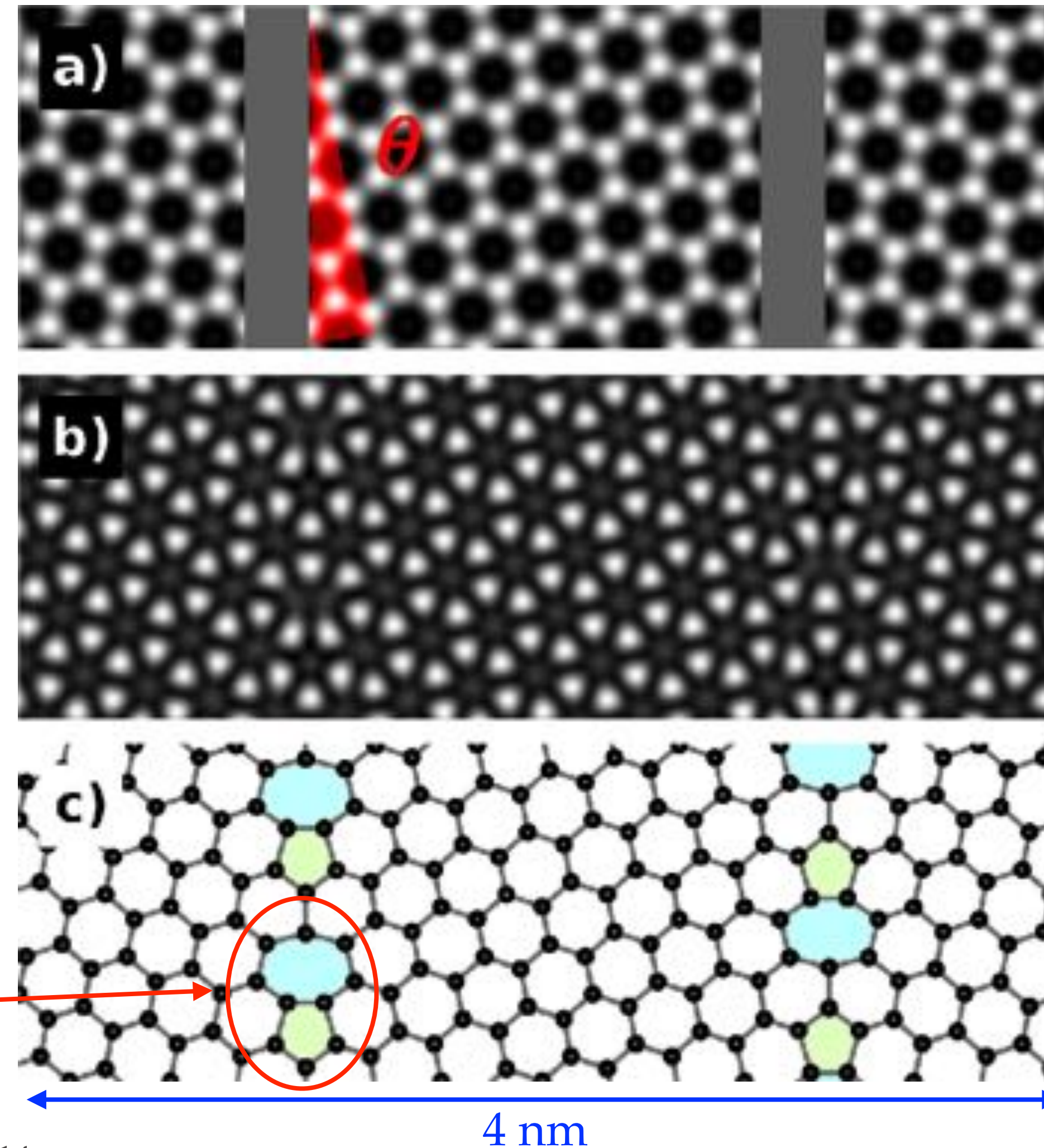
- ❖ Large, relaxed multigrain samples can be used to study e.g. heat and electrical conduction
- ❖ *Strategy:* Generate large samples with PFC1 and relax with MD (optimized Tersoff potential used here)



[H. Ago *et al.*, ACS Nano 10, 3233 (2016)]

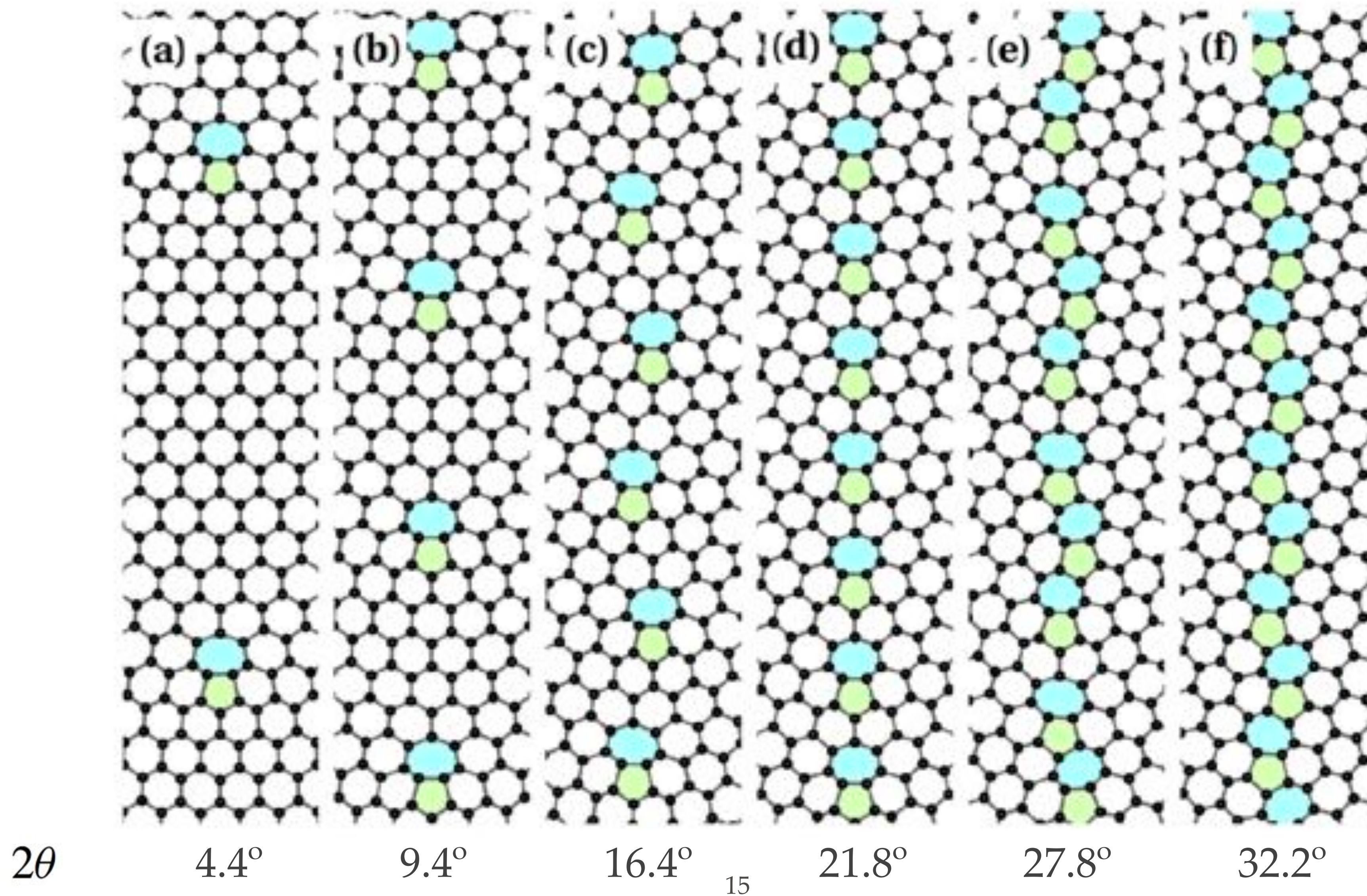
Graphene Grain Boundaries

- ❖ Bicrystalline samples are generated by having two grain boundaries with periodic boundary conditions

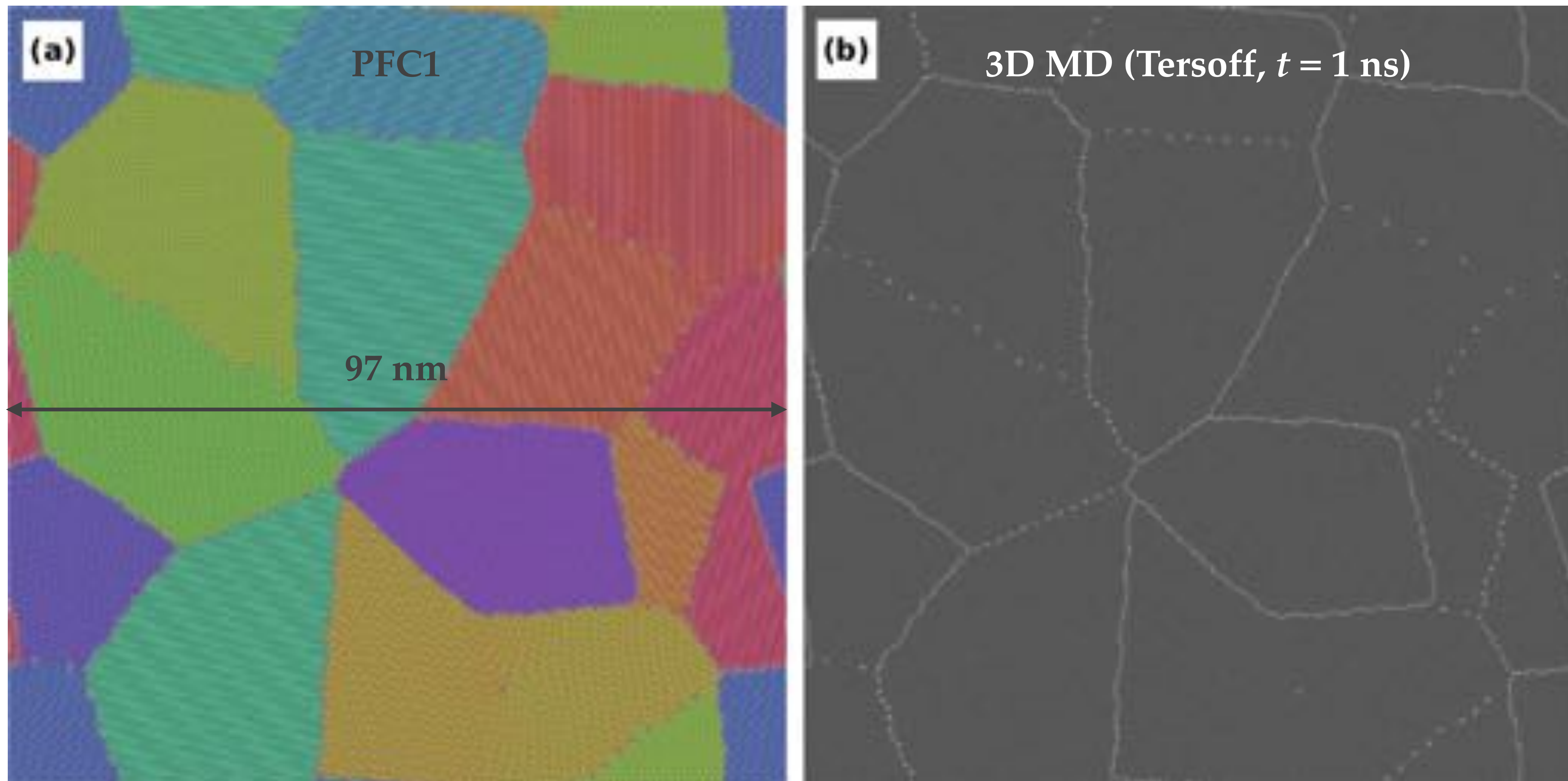


Atomic
positions

Graphene Grain Boundaries



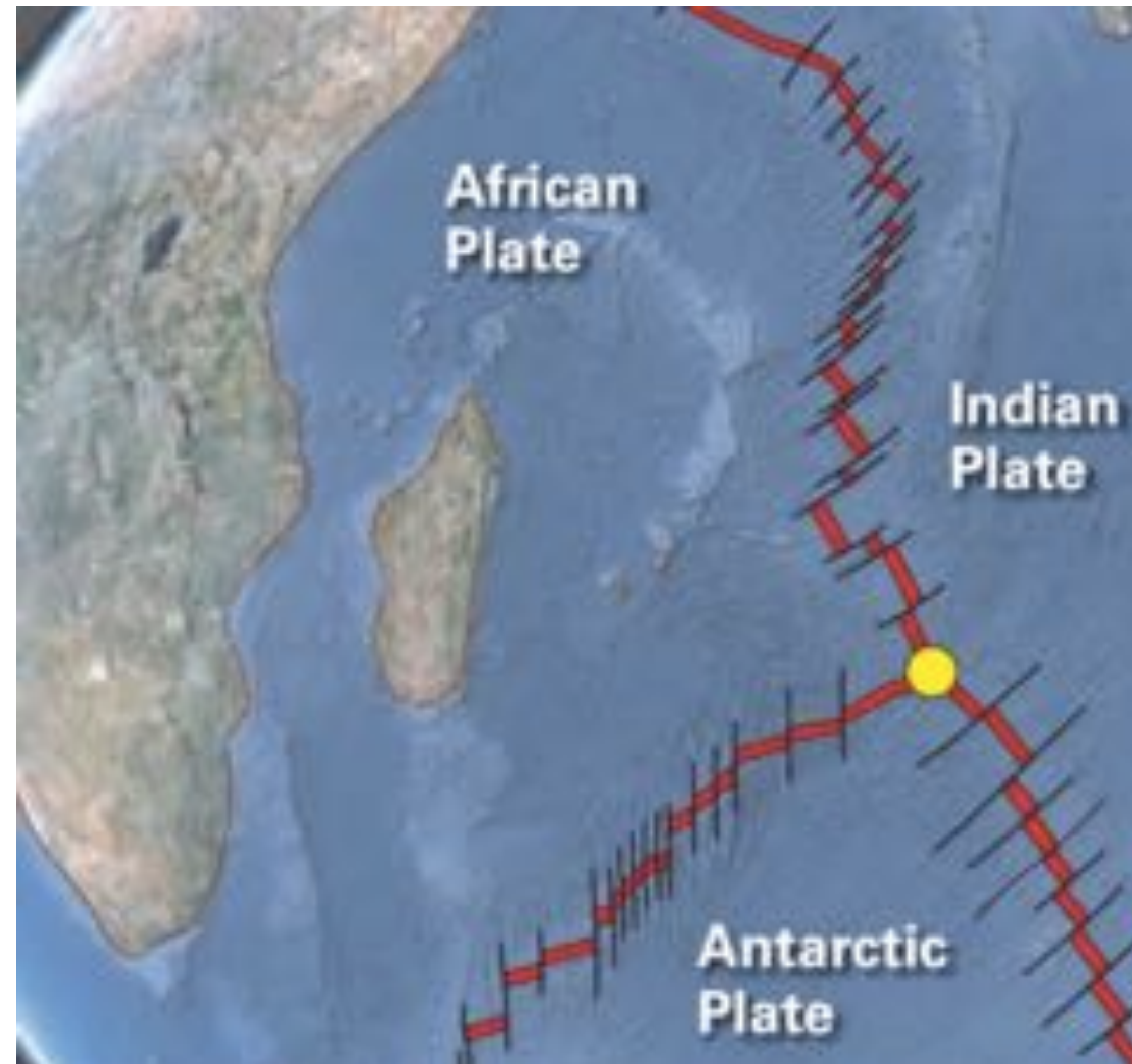
Large Multigrain Flakes



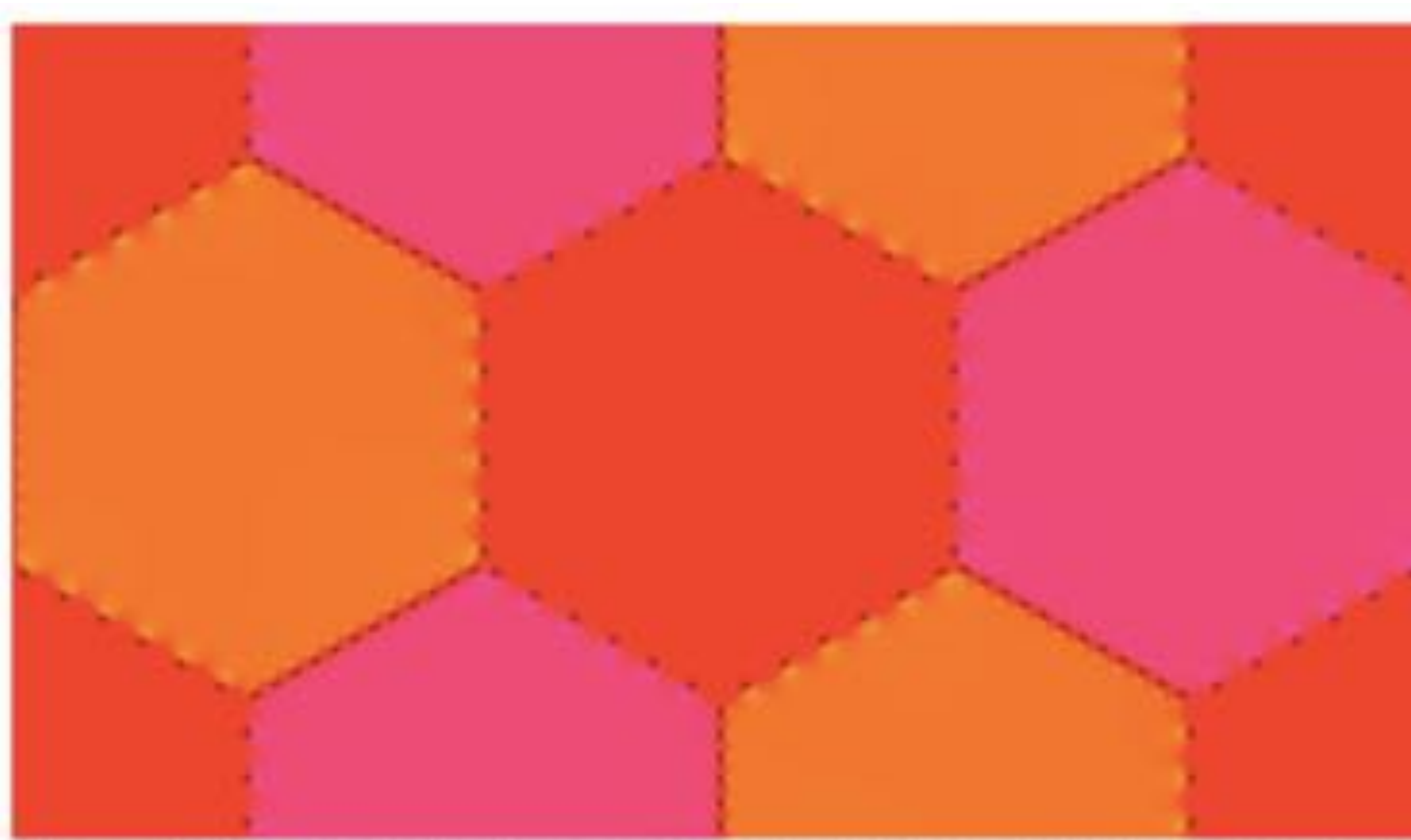
Large Multigrain Flakes



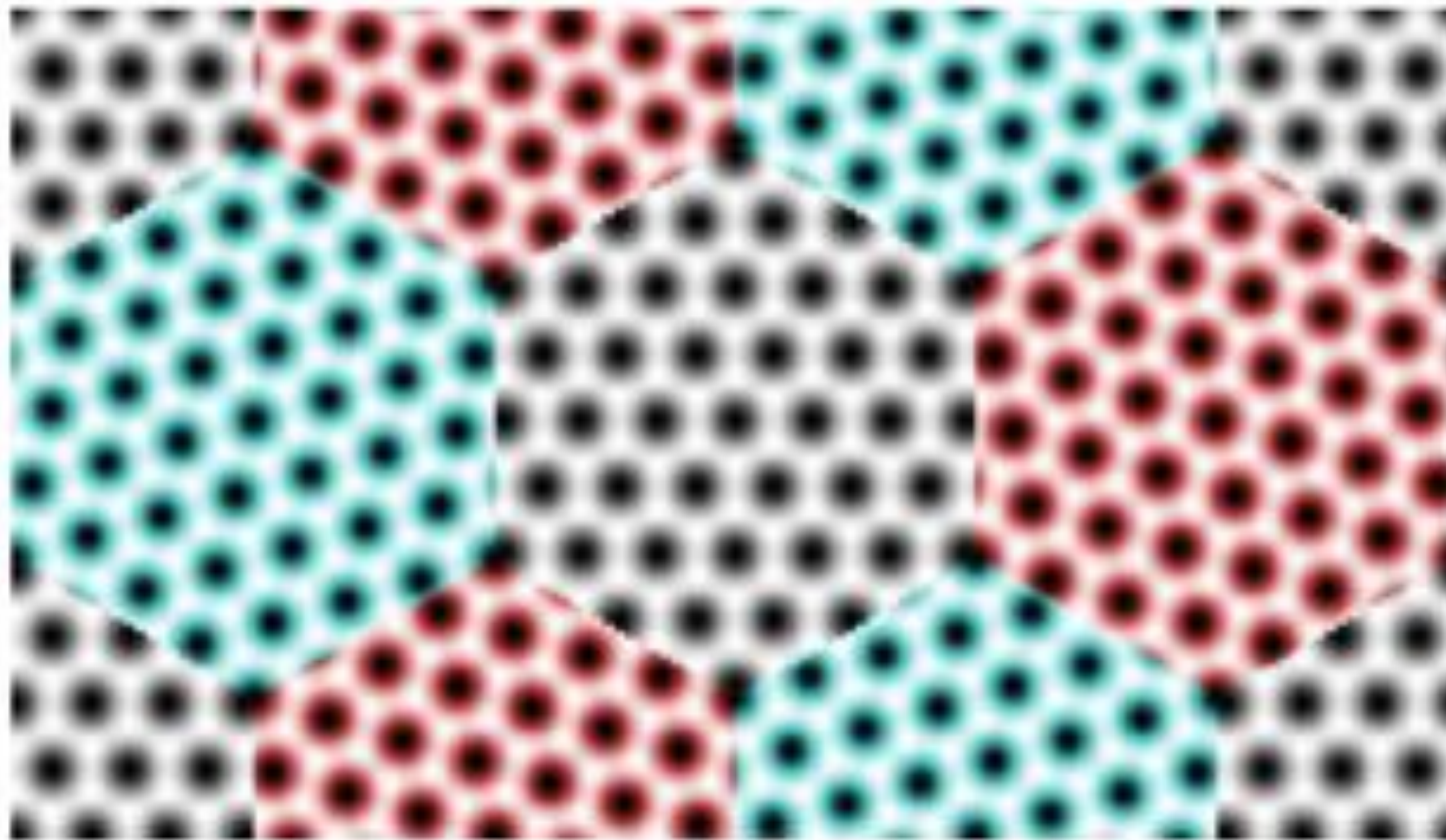
Triple Junctions



Triple Junctions in Graphene

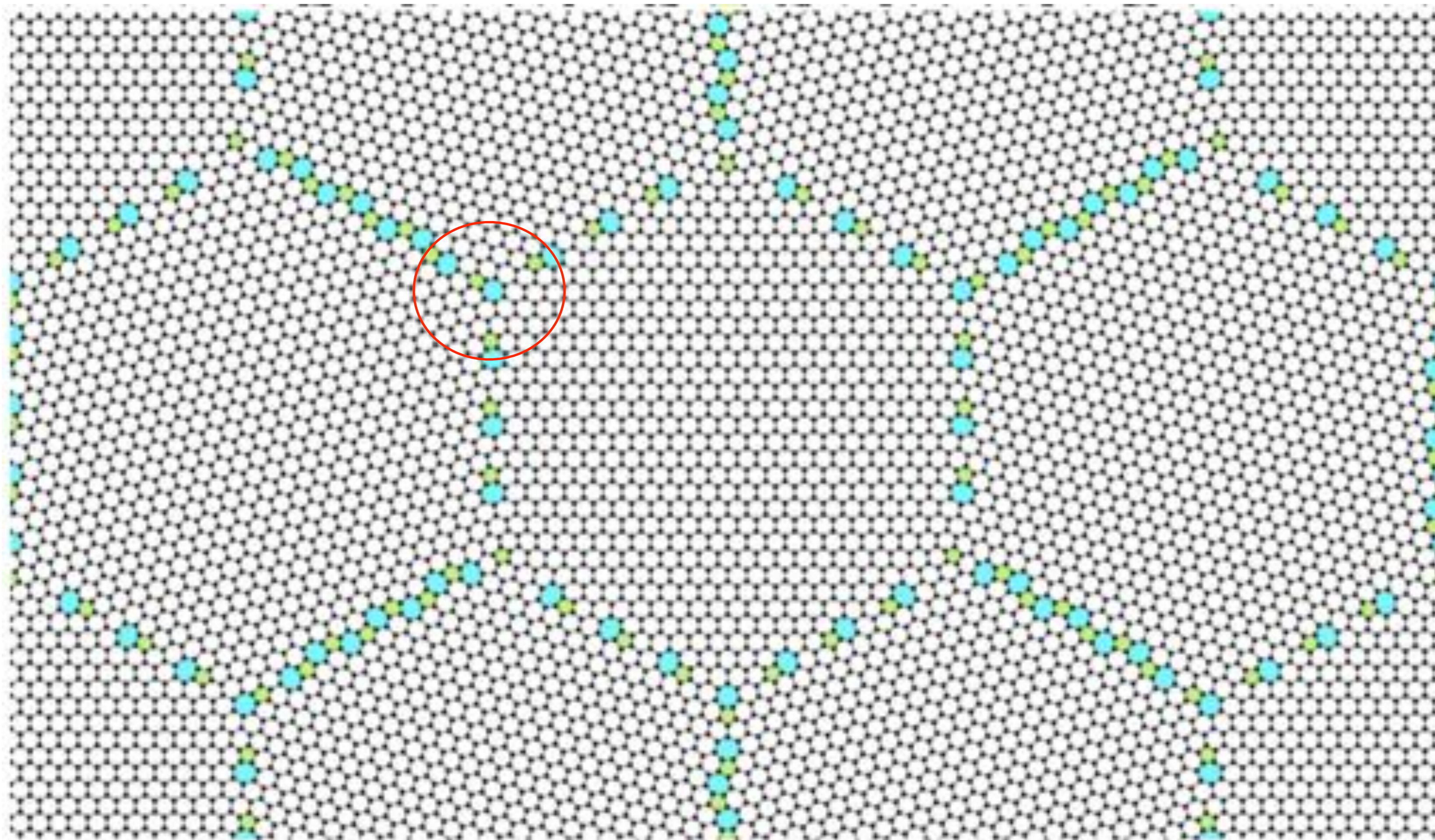


Triple Junctions in Graphene



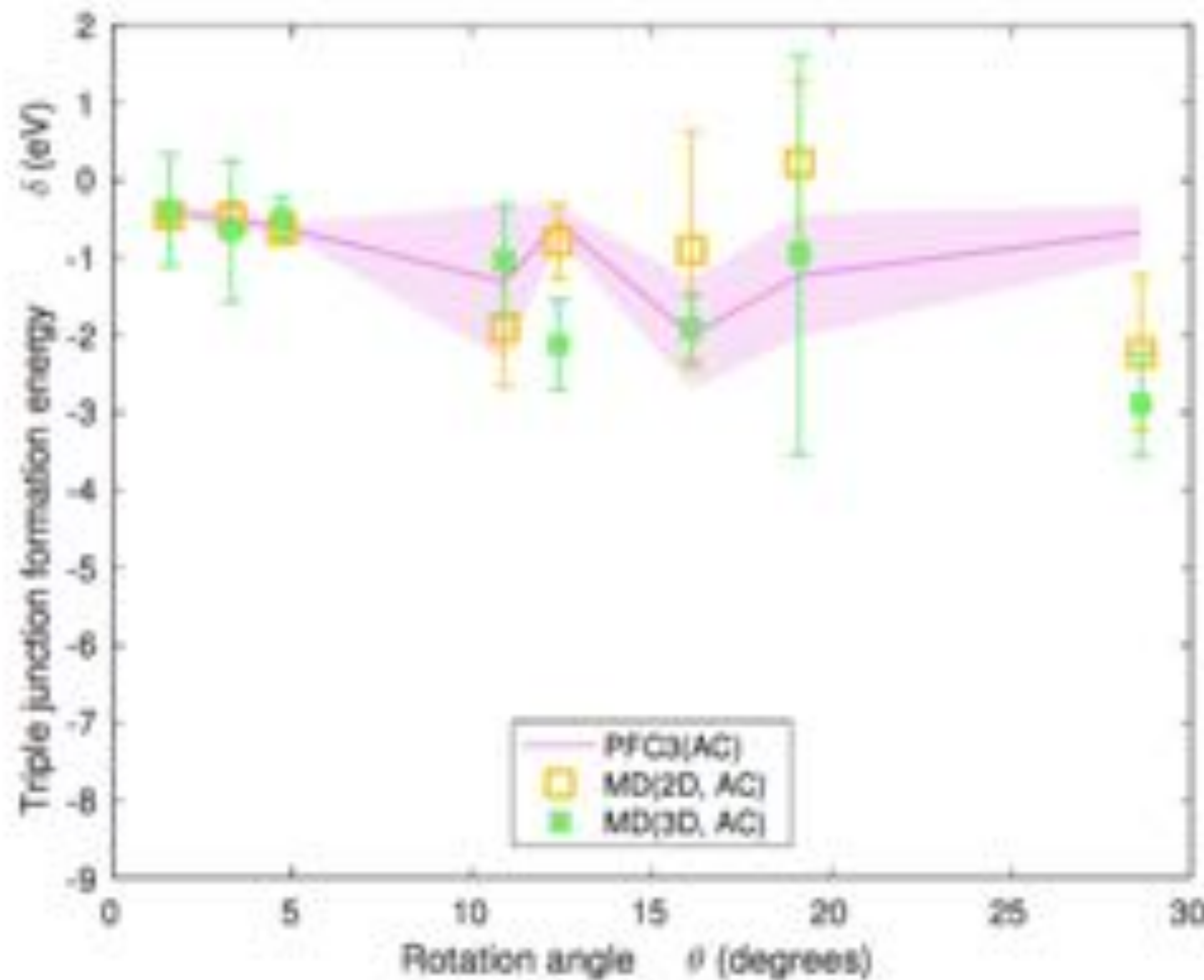
- ❖ Total energy of the system $F = f_s A + f_L L + f_p N$

Triple Junctions in Graphene



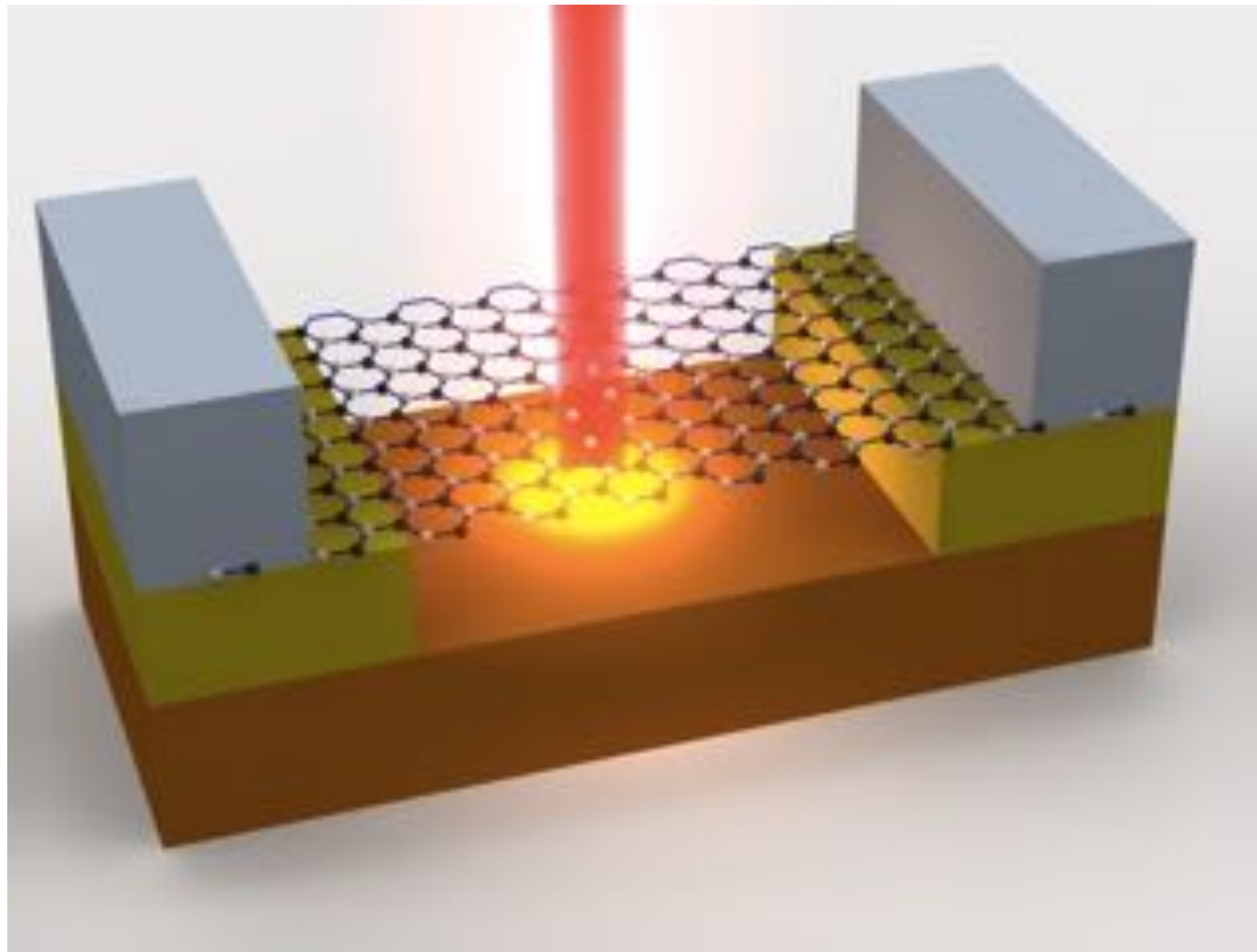
Total energy of the system $F = f_s A + f_L L + f_p N$

Triple Junctions in Graphene



- ❖ For most orientations, the triple junction formation energies are *negative*
- ❖ Grain boundary energies are 1-5 eV/nm i.e. (at least two) orders of magnitude larger and dominate the total energy

Heat Conduction in Graphene



[Z. Fan, L.F.C. Pereira, P. Hirvonen, M.M. Ervasti, K.R. Elder, D. Donadio, T. Ala-Nissila, and A. Harju, Phys. Rev. B **95**, 144309 (2017); Nano Letters **7**, 1072 (2017); K. Azizi, P. Hirvonen, Z. Fan, A. Harju, K.R. Elder, T. Ala-Nissila, and S. M. Vaez-Allaei, Carbon **125**, 384 (2017)]

Heat Conduction in Graphene

- ❖ Heat conductivity in and out-of plane can be calculated from the heat (energy) flow autocorrelation function

$$\kappa_{\mu\nu}(t) = \frac{1}{k_B T^2 V} \int_0^t dt' C_{\mu\nu}(t')$$

where

$$C_{\mu\nu}(t) = \langle J_\mu(0) J_\nu(t) \rangle$$

Heat Conduction in Graphene

- ❖ Heat conductivity in and out-of plane can be calculated from the heat (energy) flow autocorrelation function

$$\kappa_{\mu\nu}^{\text{in/out}}(t) = \frac{1}{k_B T^2 V} \int_0^t dt' C_{\mu\nu}^{\text{in/out}}(t')$$

where

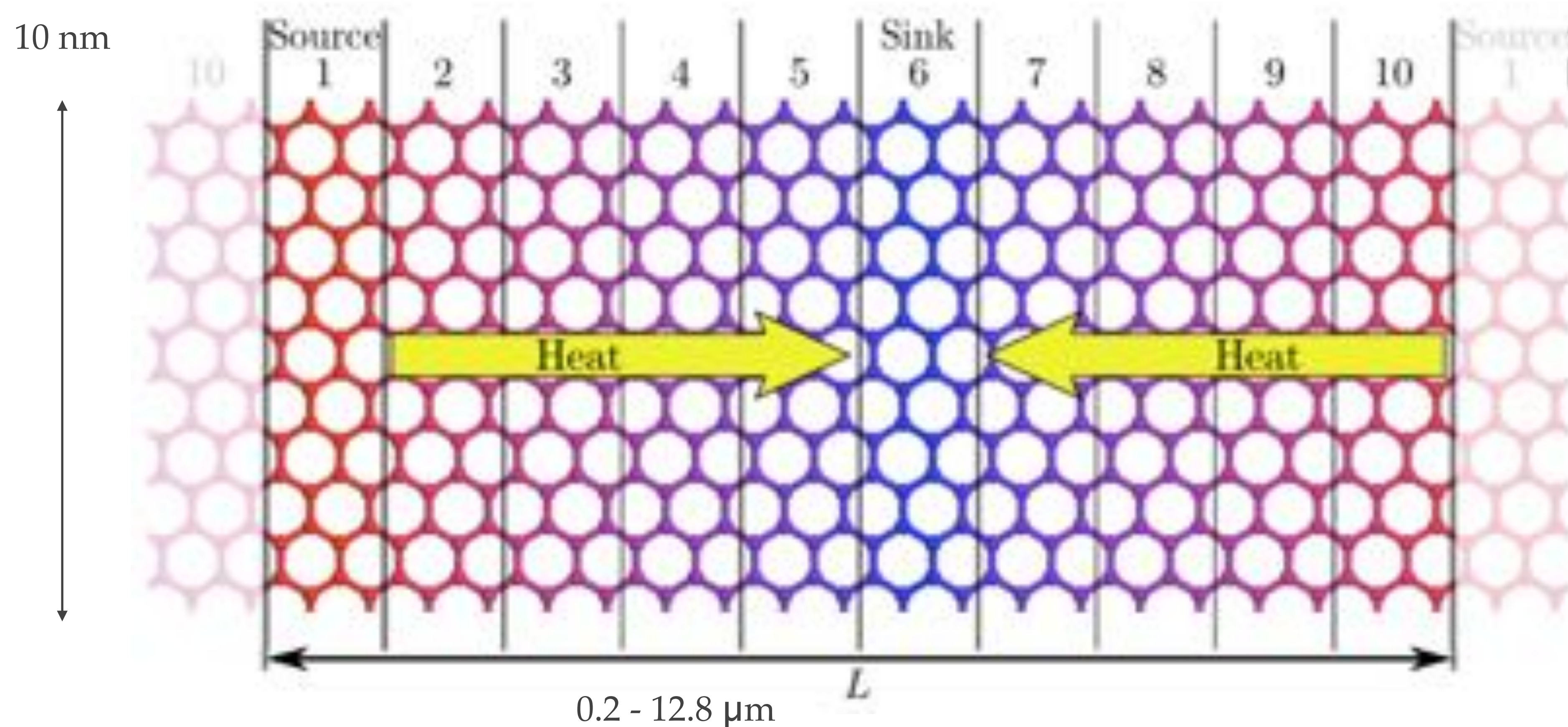
$$C_{\mu\nu}^{\text{in/out}}(t) = \langle J_{\mu}^{\text{in/out}}(0) J_{\nu}^{\text{in/out}}(t) \rangle$$

and

$$\mathbf{J}^{\text{in}} = \sum_i \sum_{j \neq i} \mathbf{r}_{ij} \left(\frac{\partial U_j}{\partial x_{ji}} v_{xi} + \frac{\partial U_j}{\partial y_{ji}} v_{yi} \right), \quad \mathbf{J}^{\text{out}} = \sum_i \sum_{j \neq i} \mathbf{r}_{ij} \left(\frac{\partial U_j}{\partial z_{ji}} v_{zi} \right)$$

Heat Conduction in Graphene

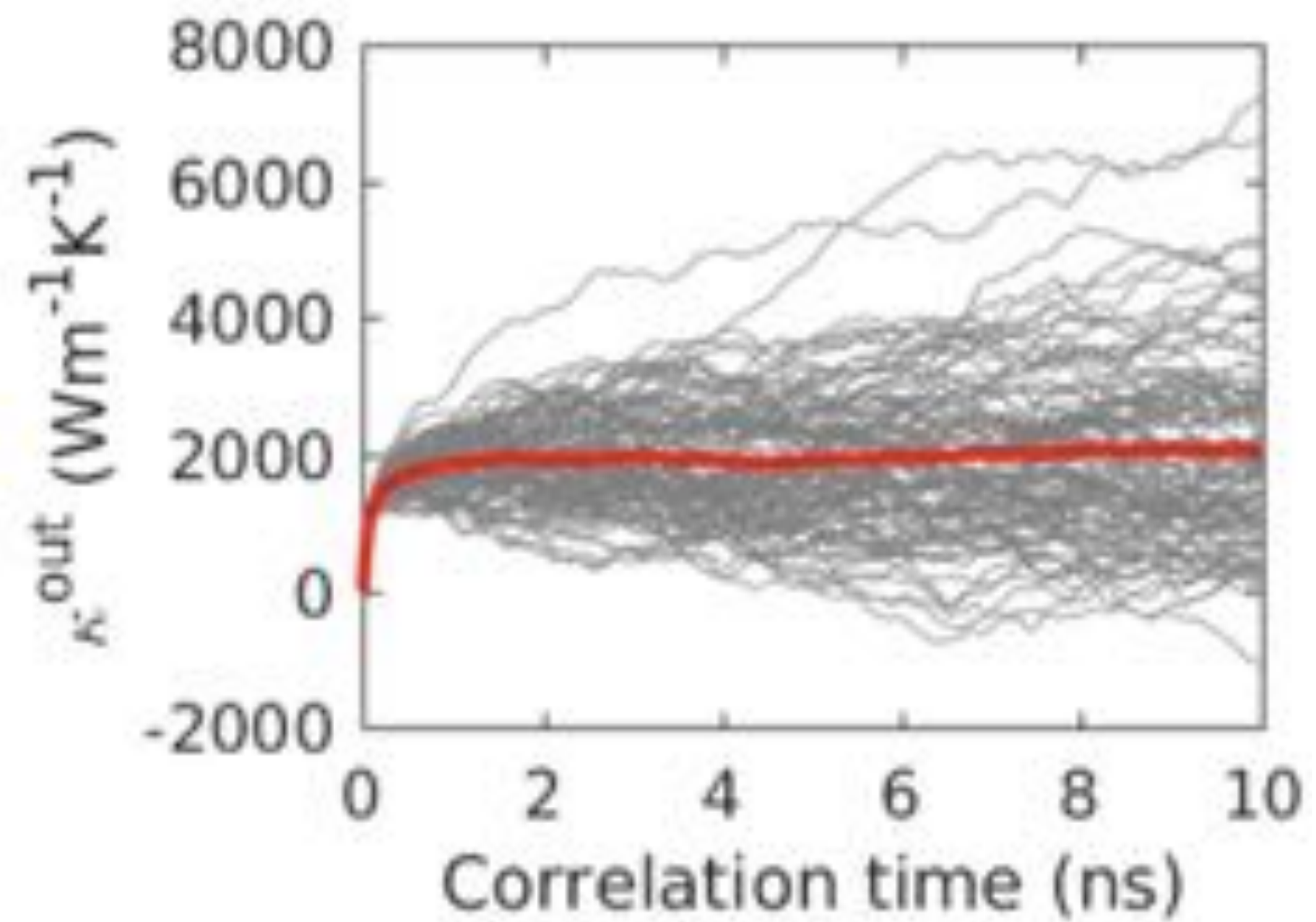
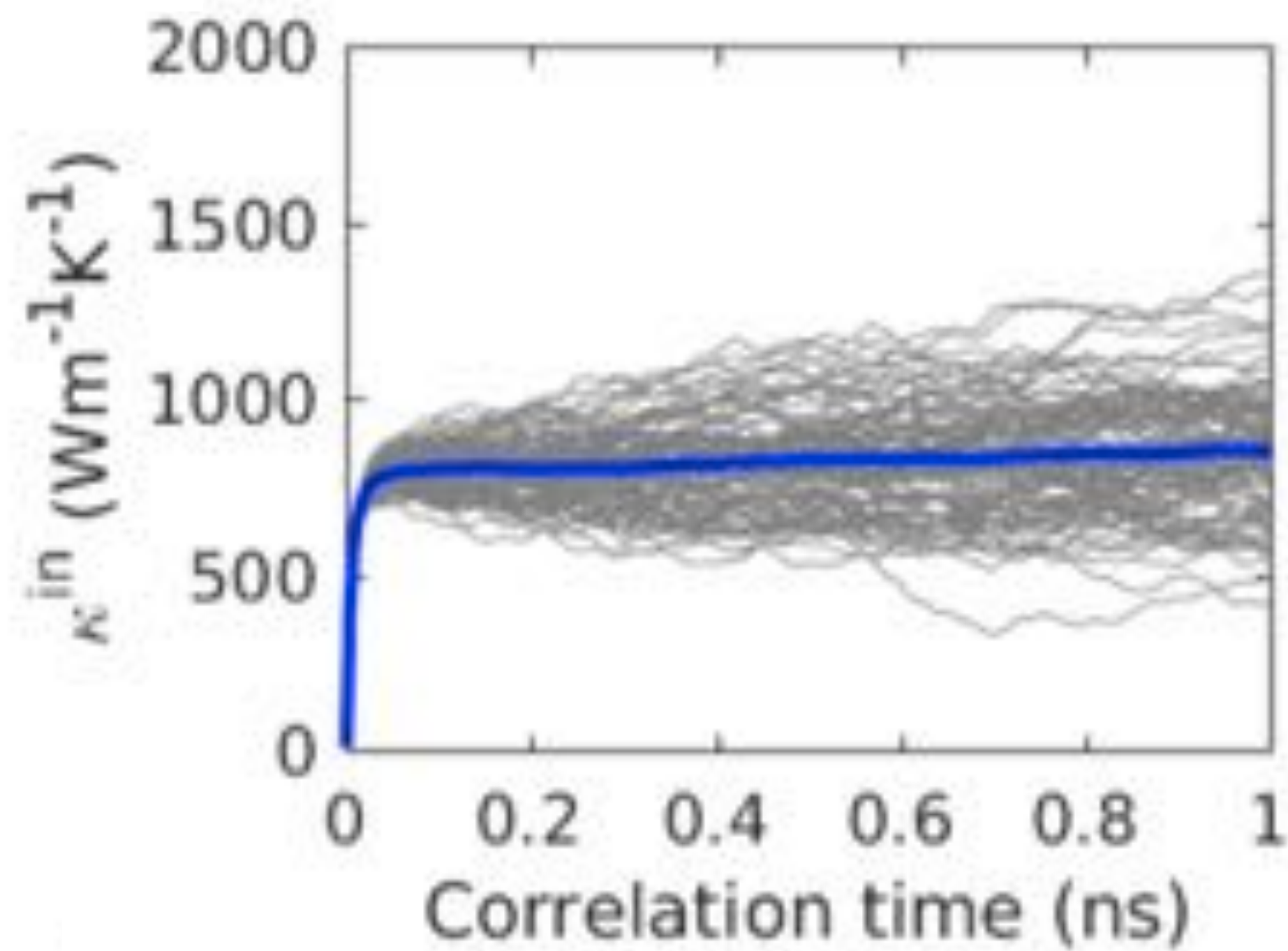
- ❖ ... or from Fourier's law by setting an external thermal gradient



$$\kappa(L) = \frac{Q^{\text{ext}}/2}{S|\nabla T|}$$

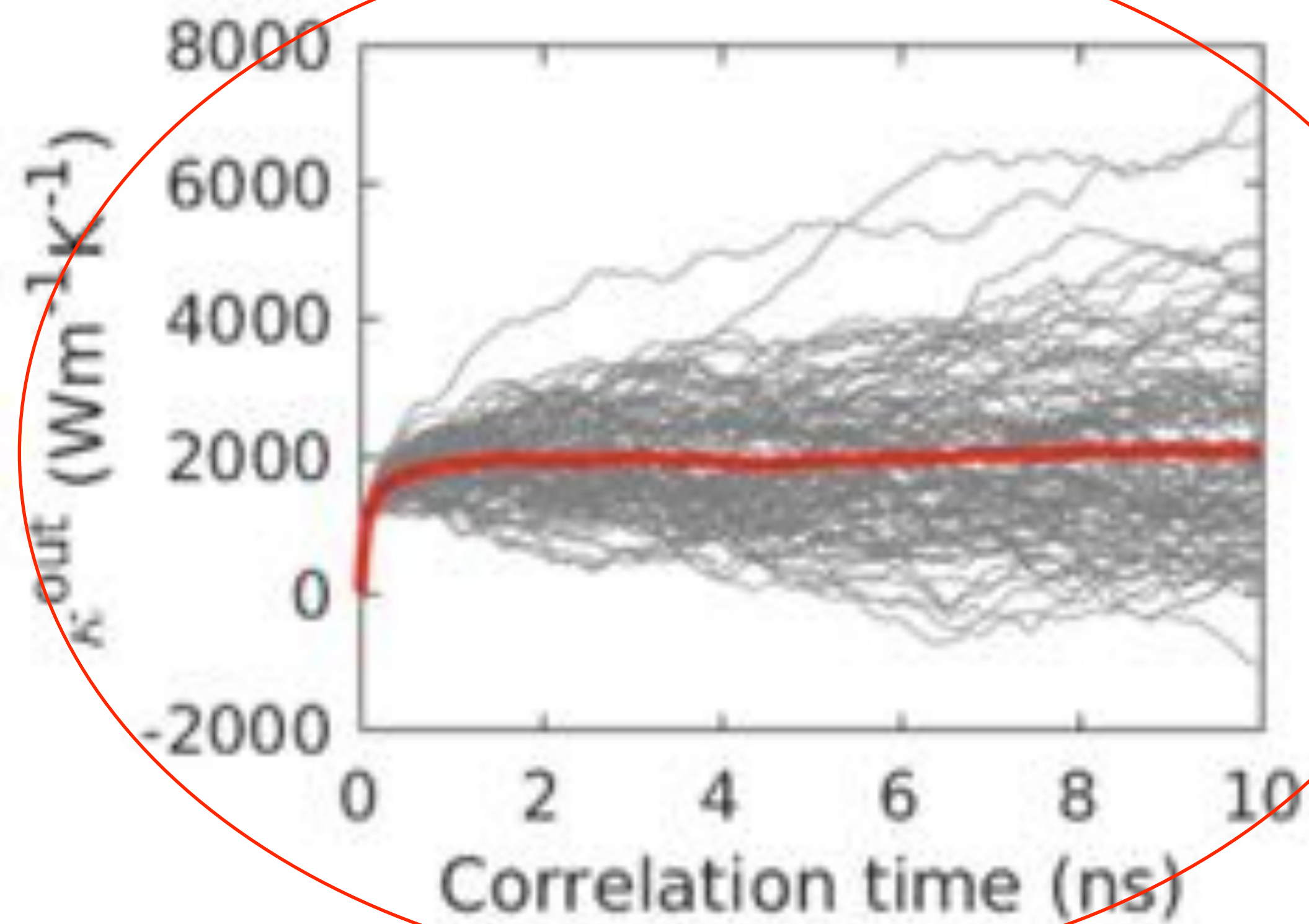
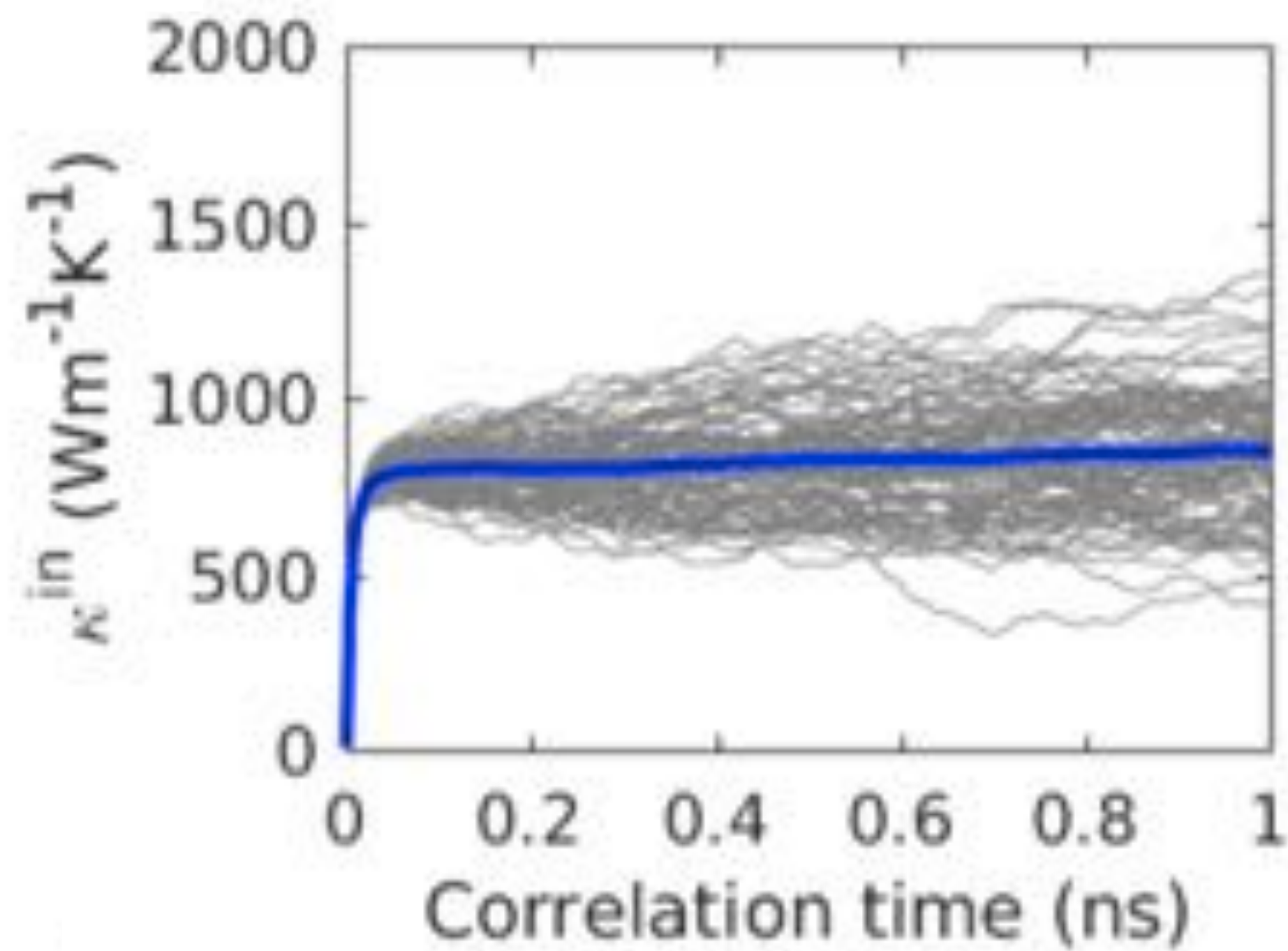
Heat Conduction in Pristine Graphene

- ❖ The *out-of-plane component converges much slower* than the in-plane one



Heat Conduction in Pristine Graphene

- ❖ The *out-of-plane component converges much slower* than the in-plane one



Heat Conduction in Pristine Graphene

- ❖ For pristine graphene we find at $T = 300$ K (MD with opt. Tersoff)

$$\kappa_0^{\text{in}} \approx 800 \text{ Wm}^{-1}\text{K}^{-1} \text{ and } \kappa_0^{\text{out}} \approx 2\,100 \text{ Wm}^{-1}\text{K}^{-1}$$

$$\kappa_0 = \kappa_0^{\text{in}} + \kappa_0^{\text{out}} = 2\,900 \text{ Wm}^{-1}\text{K}^{-1}$$

Experimentally $\kappa_0 \approx 1500 - 2500 \text{ Wm}^{-1}\text{K}^{-1}$

Heat Conduction in Pristine Graphene

- ❖ For pristine graphene we find at $T = 300$ K (MD with opt. Tersoff)

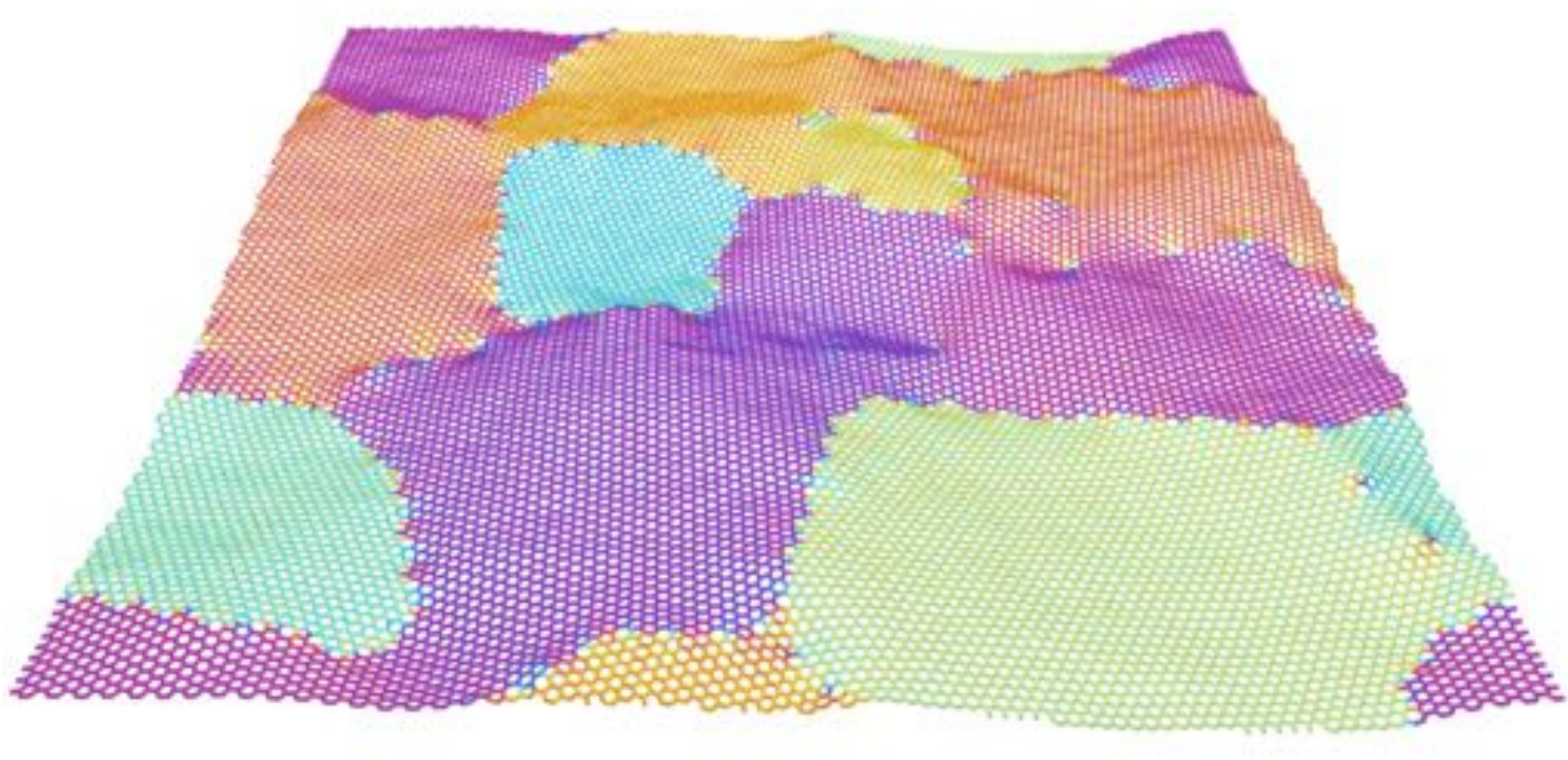
$$\kappa_0^{\text{in}} \approx 800 \text{ Wm}^{-1}\text{K}^{-1} \text{ and } \kappa_0^{\text{out}} \approx 2\,100 \text{ Wm}^{-1}\text{K}^{-1}$$

$$\kappa_0 = \kappa_0^{\text{in}} + \kappa_0^{\text{out}} = 2\,900 \text{ Wm}^{-1}\text{K}^{-1}$$

Experimentally $\kappa_0 \approx 1500 - 2500 \text{ Wm}^{-1}\text{K}^{-1}$

- ❖ For uniaxially strained graphene the out-of-plane component diverges for 2% strain

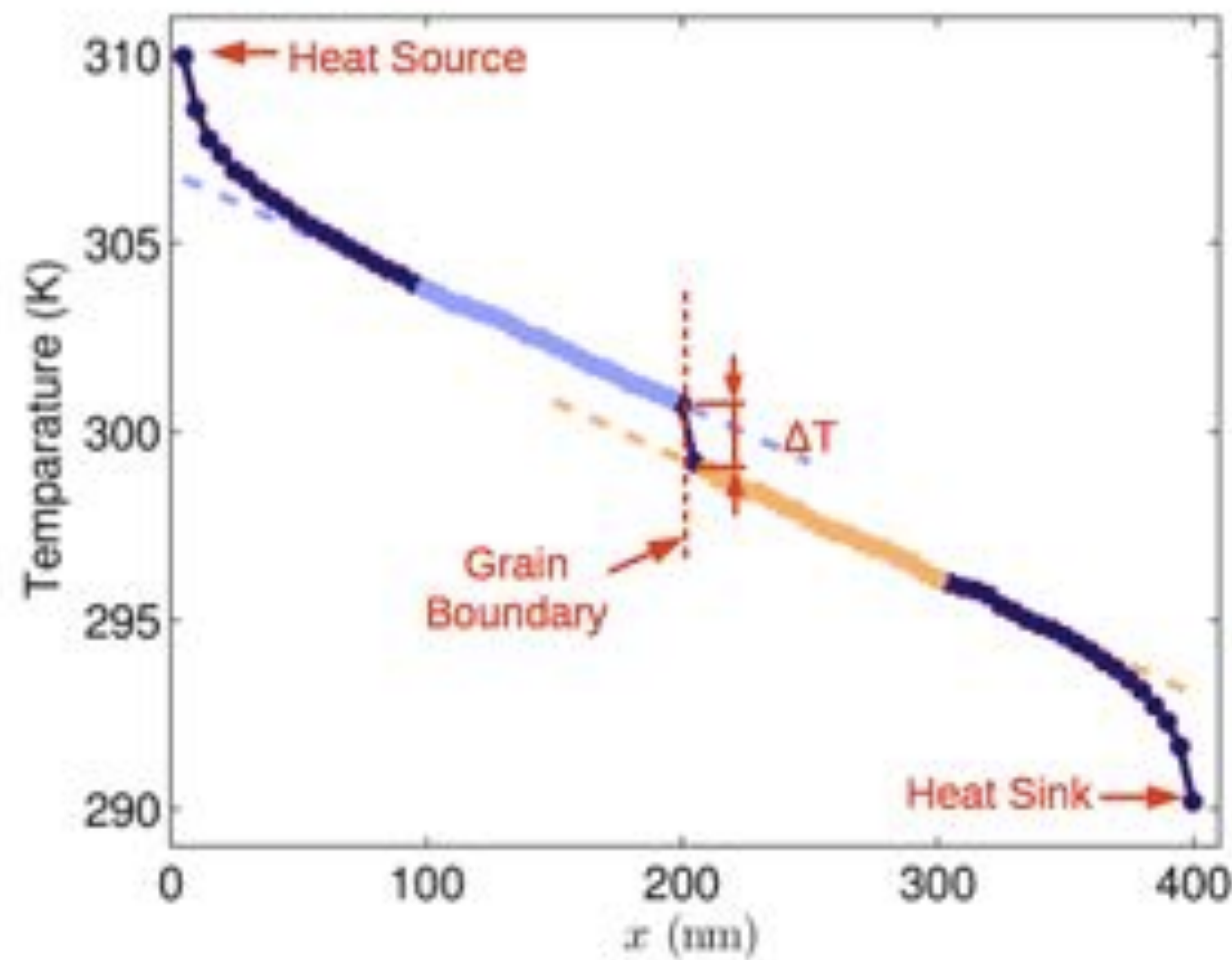
Heat Conduction in Multigrain Flakes



Heat Conduction in Multigrain Flakes

- ❖ Heat flow across an interface is characterised by *Kapitza conductance*

$$Q = G\Delta T$$



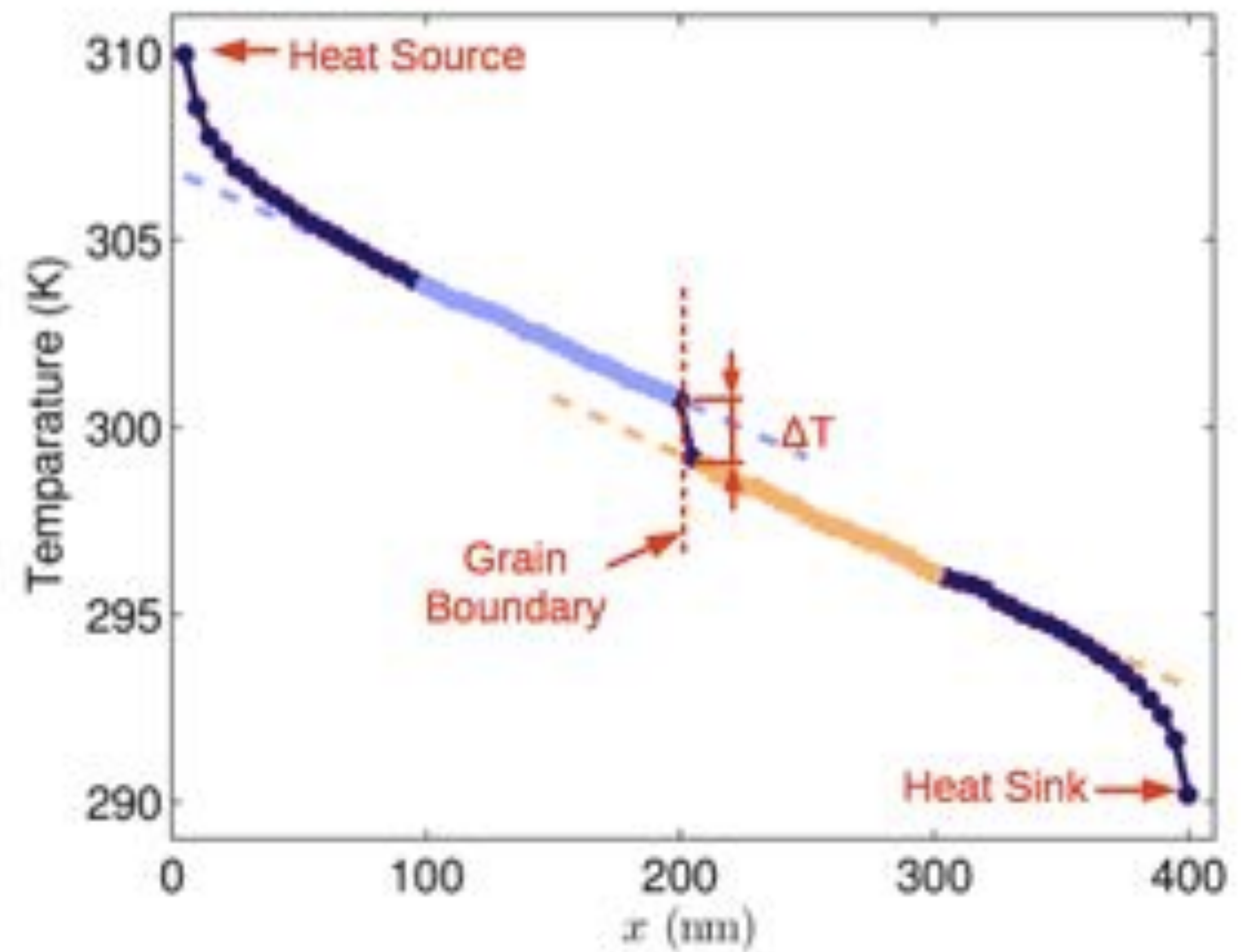
Heat Conduction in Multigrain Flakes

- ❖ Heat flow across an interface is characterised by *Kapitza conductance*

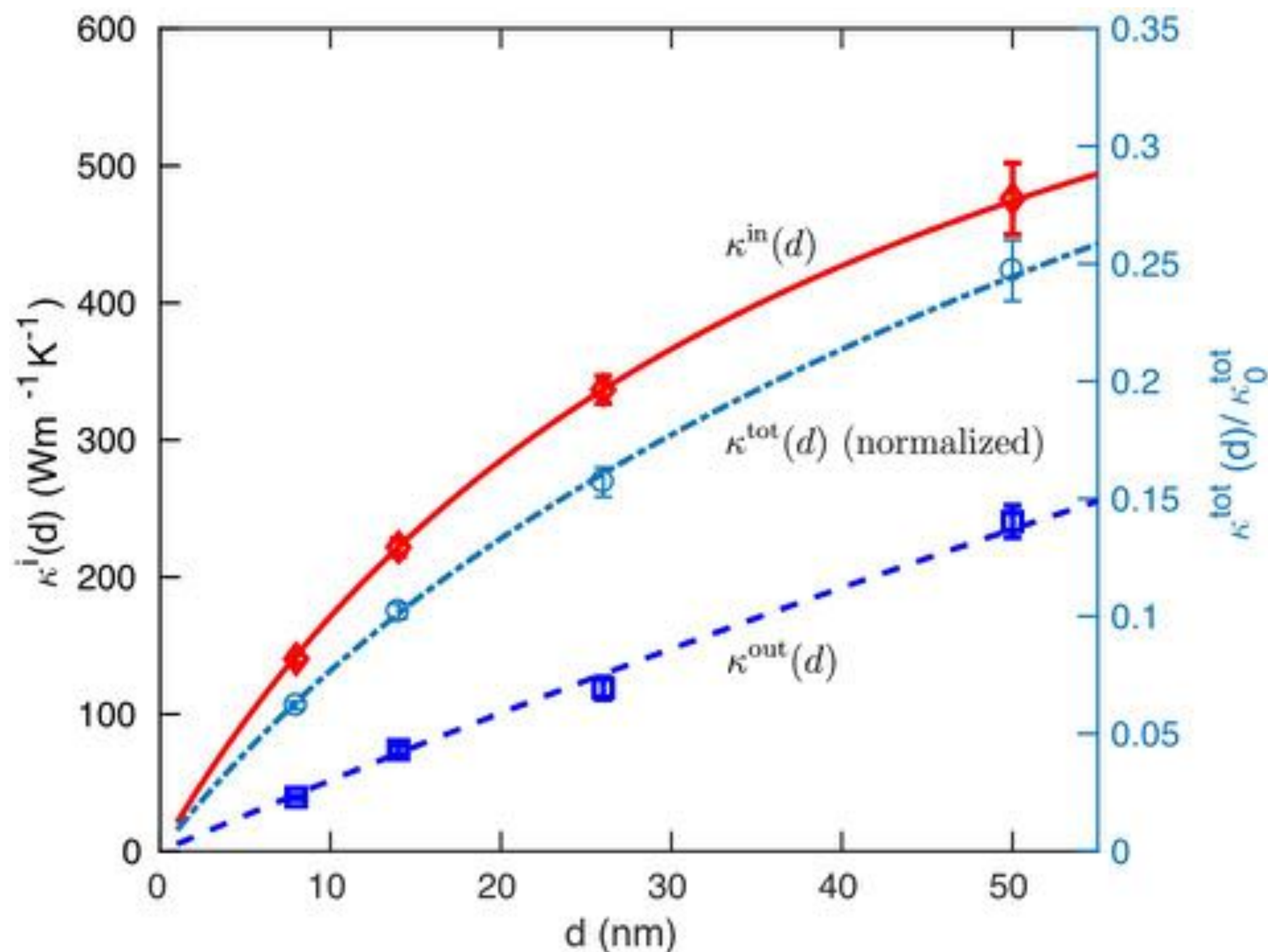
$$Q = G\Delta T$$

- ❖ The *Kapitza length* L equals the thickness of the material of thermal conductivity κ that provides the same change in temperature as a given interface

$$L^i = \kappa^i / G^i \quad (i = \text{in, out})$$

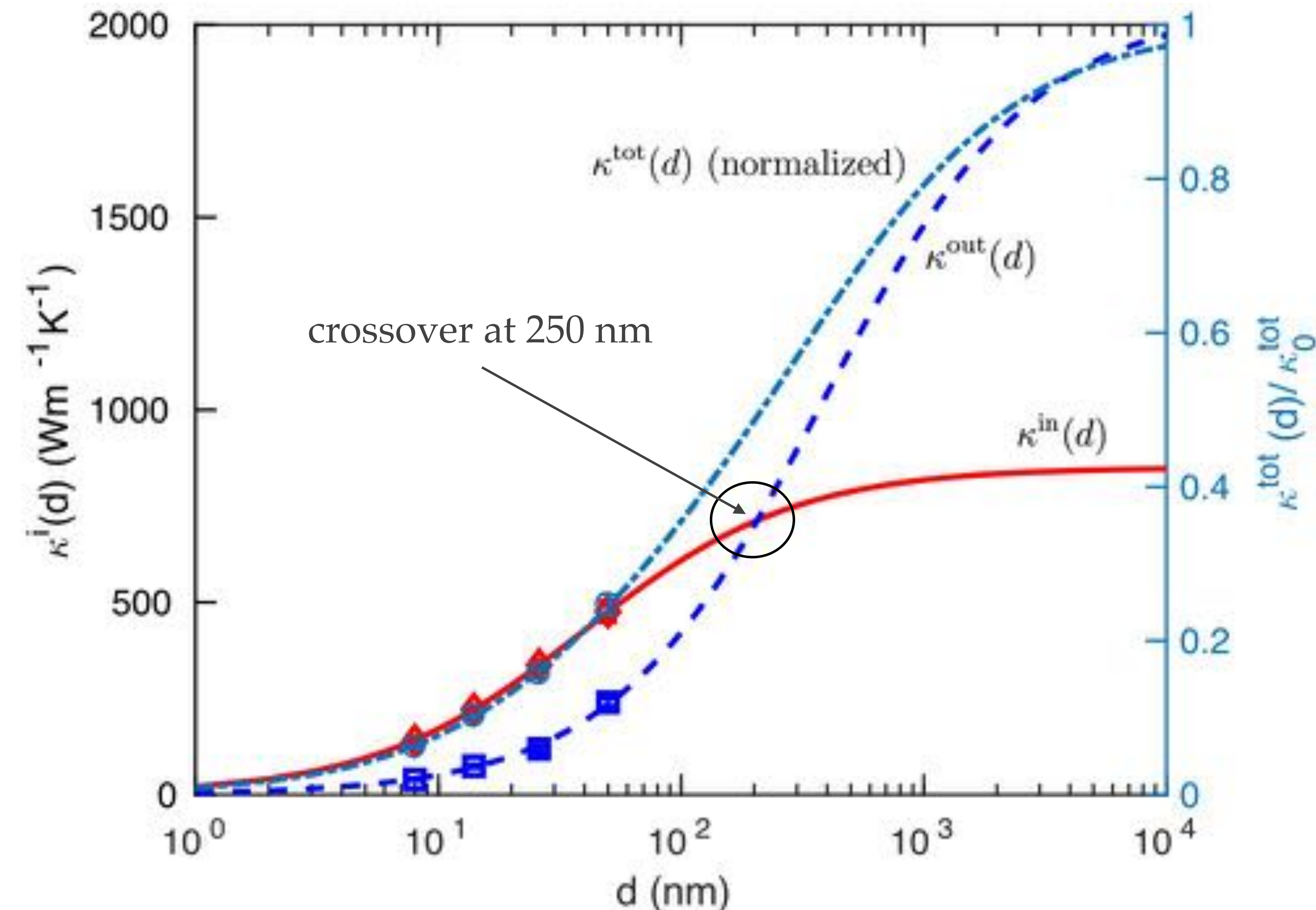


Heat Conduction in Multigrain Flakes



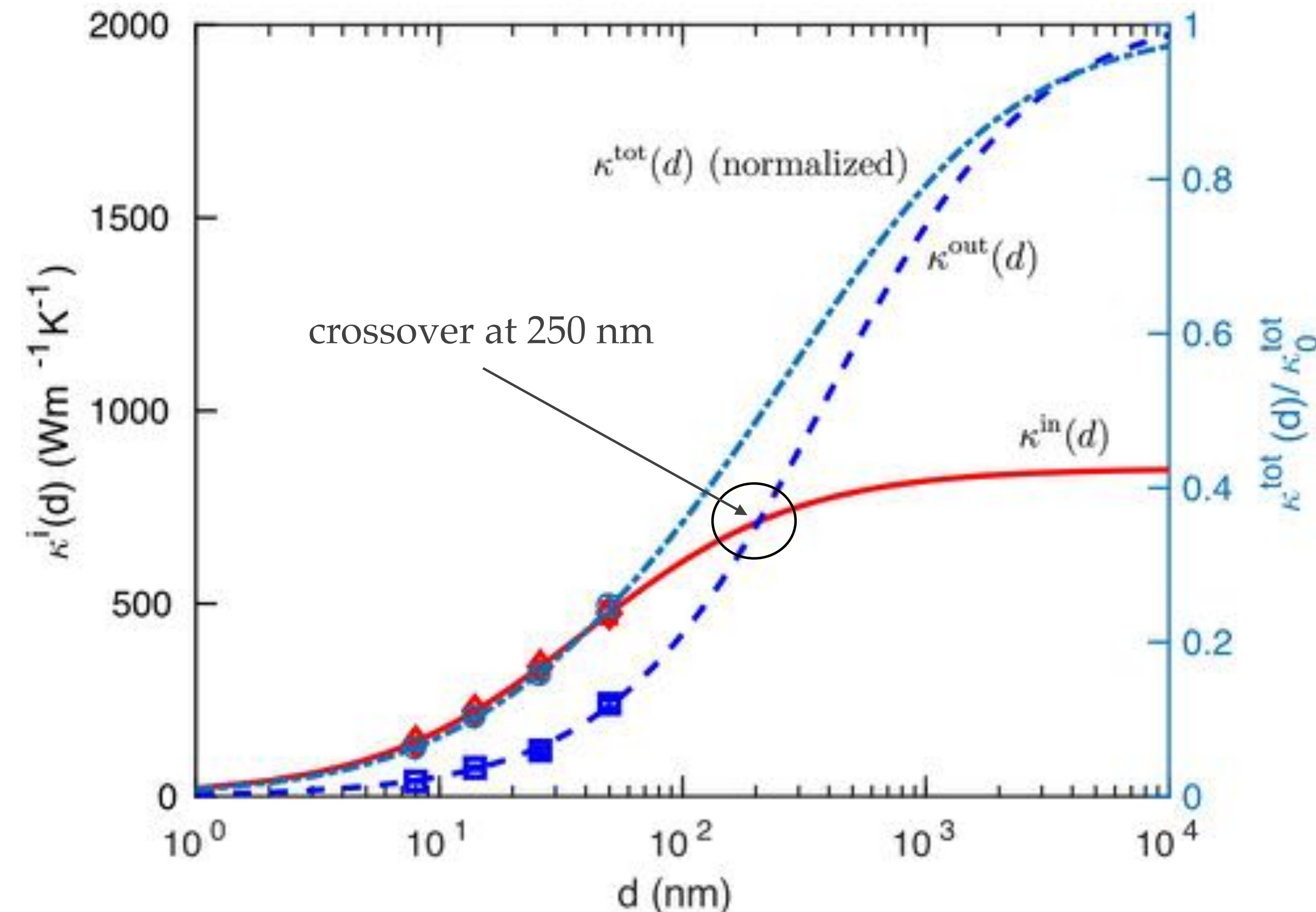
- ❖ Heat conductivity out of plane is *strongly suppressed* by grains

Heat Conduction in Multigrain Flakes



- ❖ Heat conductivity out of plane is *strongly suppressed* by grains

Heat Conduction in Multigrain Flakes



- ❖ Heat conductivity out of plane is *strongly suppressed* by grains
- ❖ The Kapitza length L for out of plane is an *order of magnitude larger* than that of the in-plane

$$L^{\text{out}} \approx 400 \text{ nm} \gg L^{\text{in}} \approx 40 \text{ nm}$$

Heat Conduction in Multigrain Flakes



Heat Conduction in Multigrain Flakes

ARTICLE

Received 30 Jan 2016 | Accepted 5 Jan 2017 | Published 16 Feb 2017

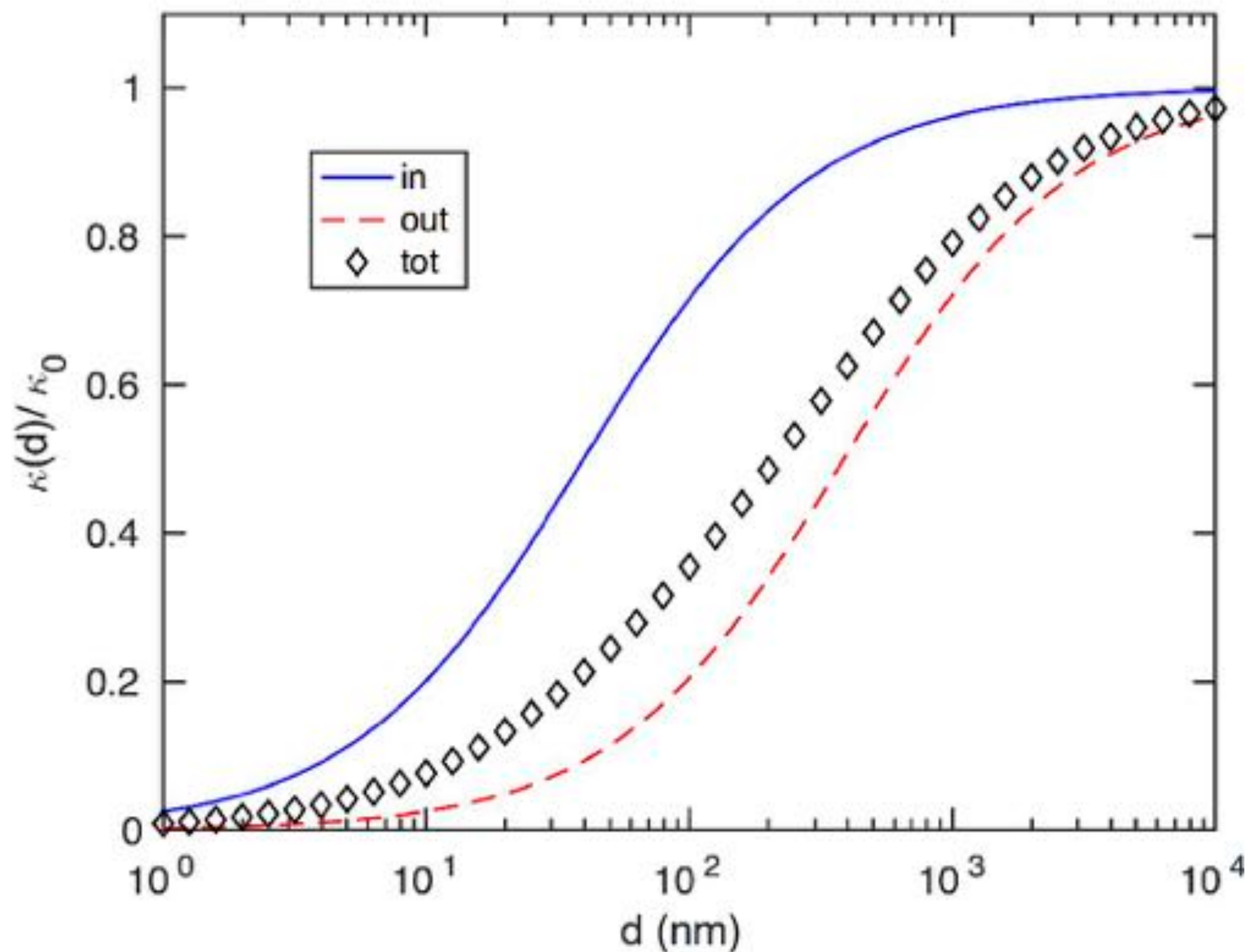
DOI: 10.1038/ncomms14486

OPEN

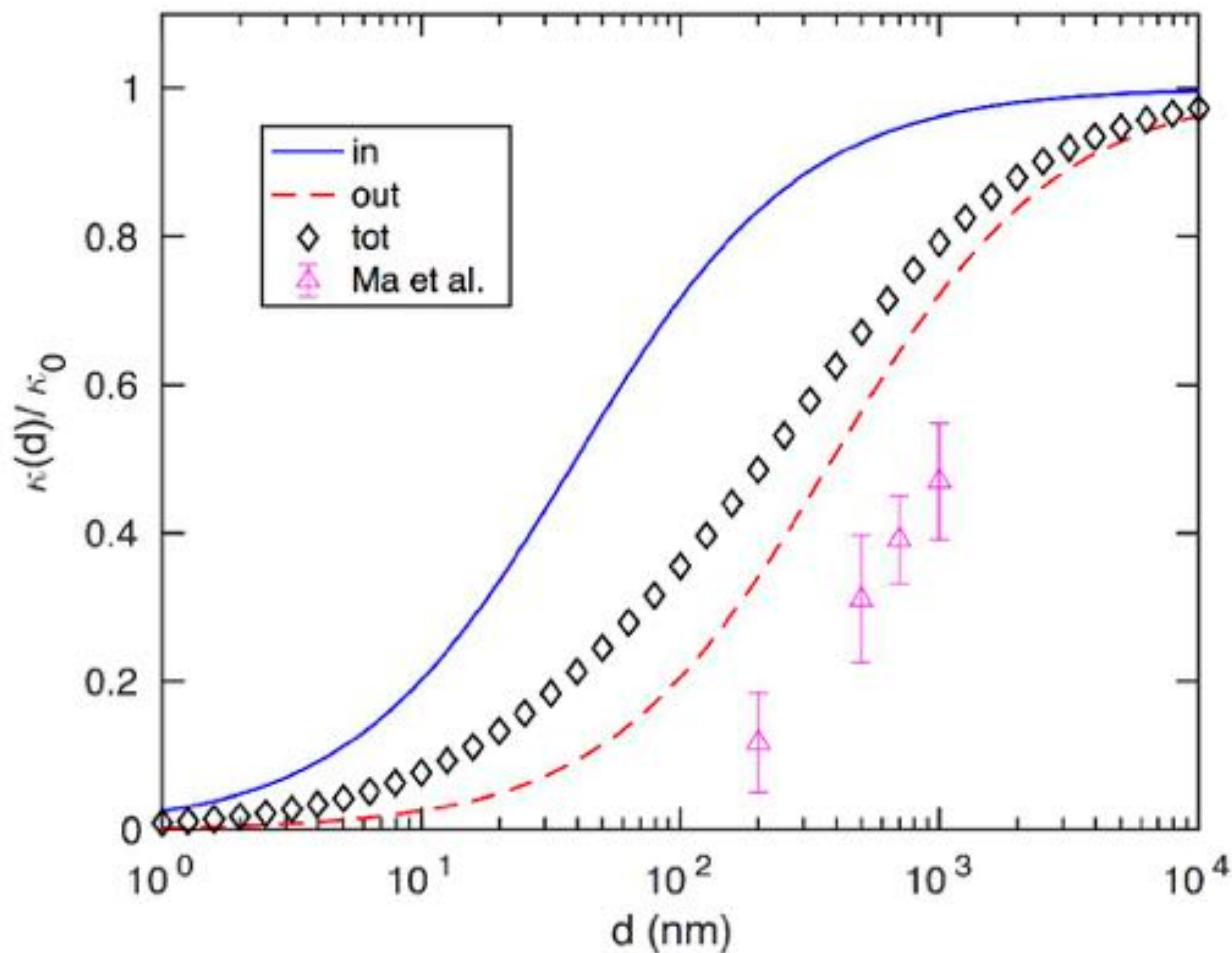
Tailoring the thermal and electrical transport properties of graphene films by grain size engineering

Teng Ma¹, Zhibo Liu¹, Jinxiu Wen², Yang Gao¹, Xibiao Ren³, Huanjun Chen², Chuanhong Jin³, Xiu-Liang Ma¹, Ningsheng Xu², Hui-Ming Cheng¹ & Wencai Ren¹

Heat Conduction in Multigrain Flakes



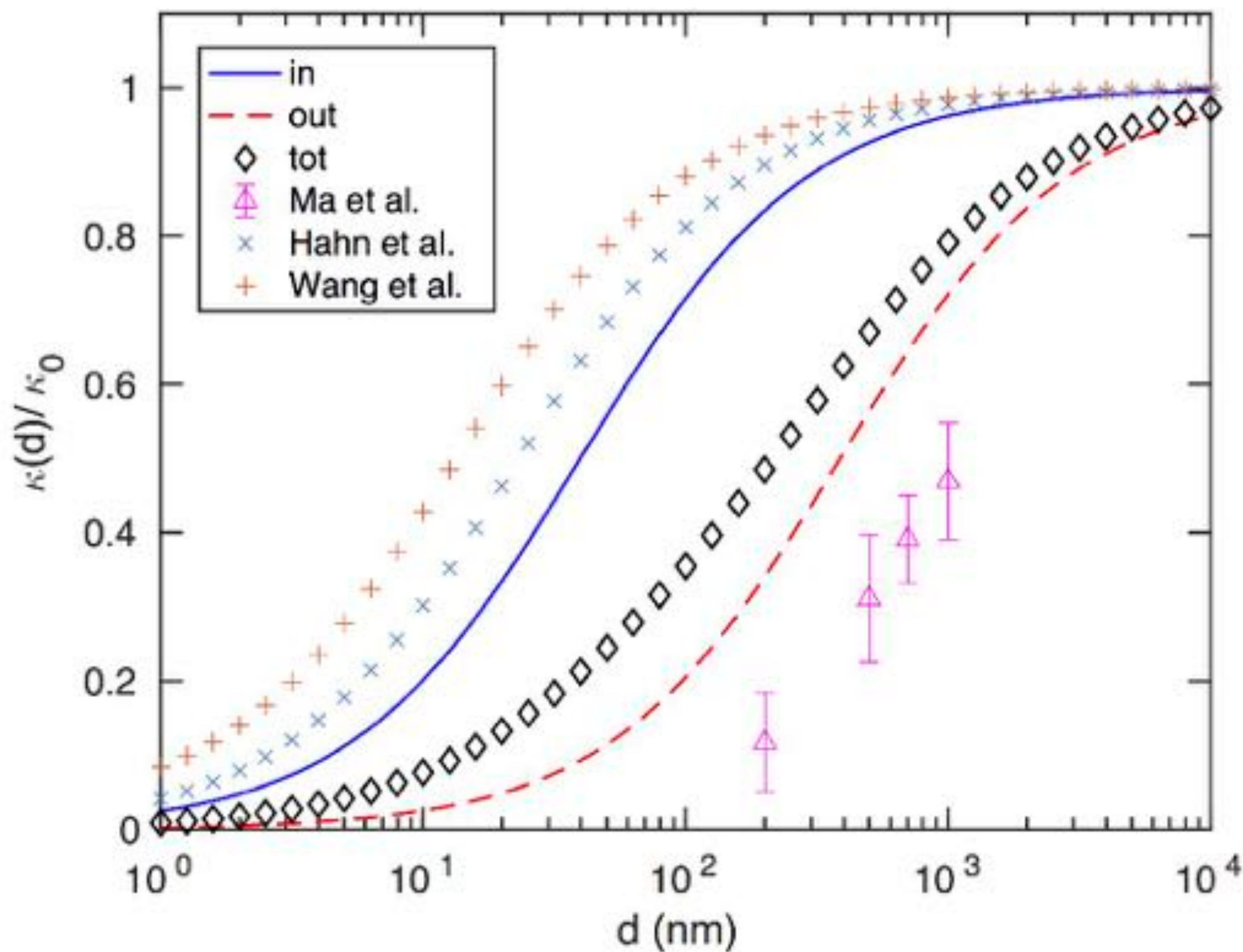
Heat Conduction in Multigrain Flakes



Heat Conduction in Multigrain Flakes

[Y. Wang *et al.*, J. Mater. Res. **29**, 362 (2014)]

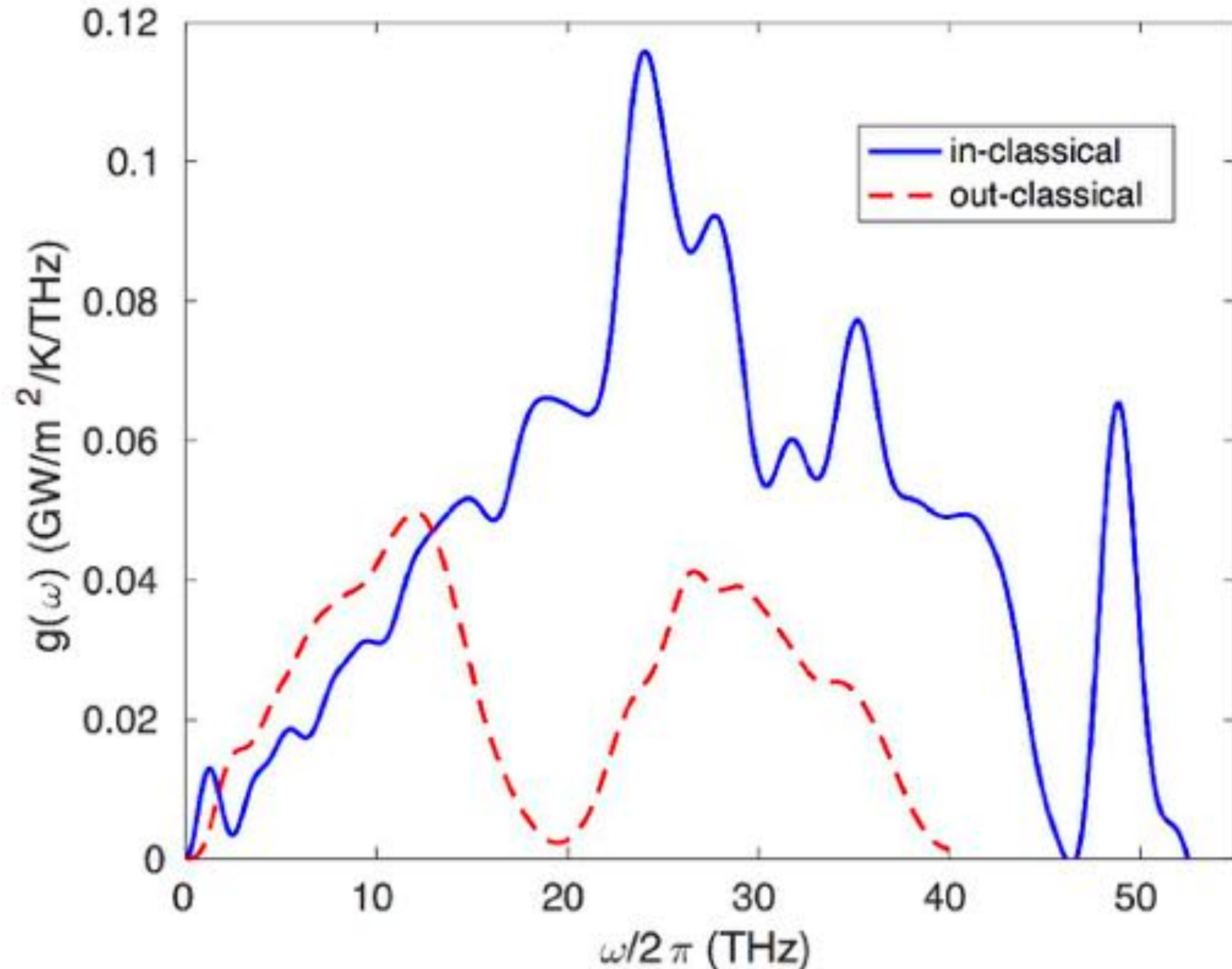
[K.R. Hahn *et al.*, Carbon **96**, 429 (2016)]



Heat Conduction in Multigrain Flakes



Heat Conduction in Multigrain Flakes

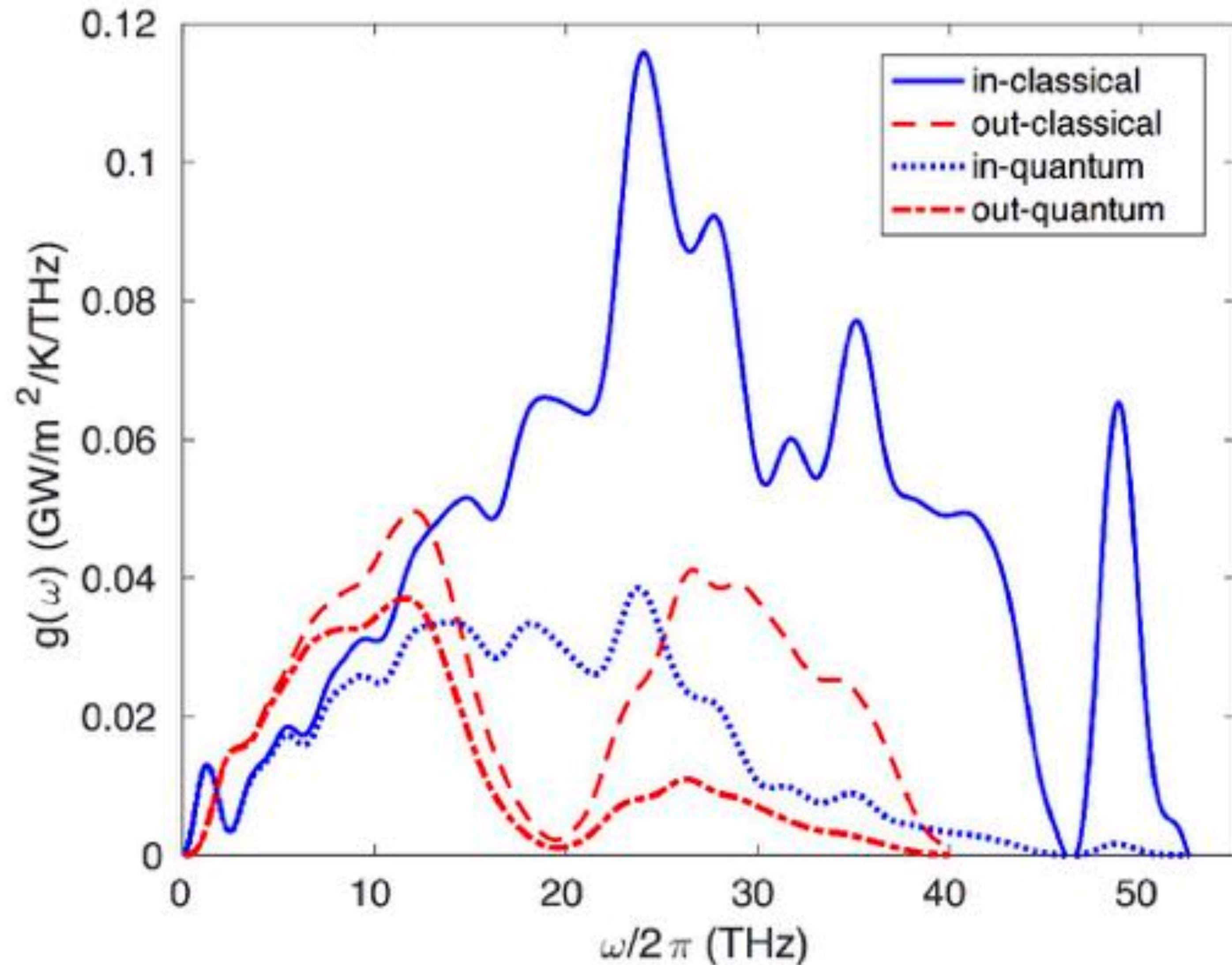


❖ Spectral conductance

$$g_{A \rightarrow B}^{\text{in/out}}(\omega) = \frac{q_{A \rightarrow B}^{\text{in/out}}(\omega)}{S|\Delta T|}$$

[K. Sääskilahti *et al.*, AIP Adv. **6**, 12190 (2016)]

Heat Conduction in Multigrain Flakes



❖ Spectral conductance

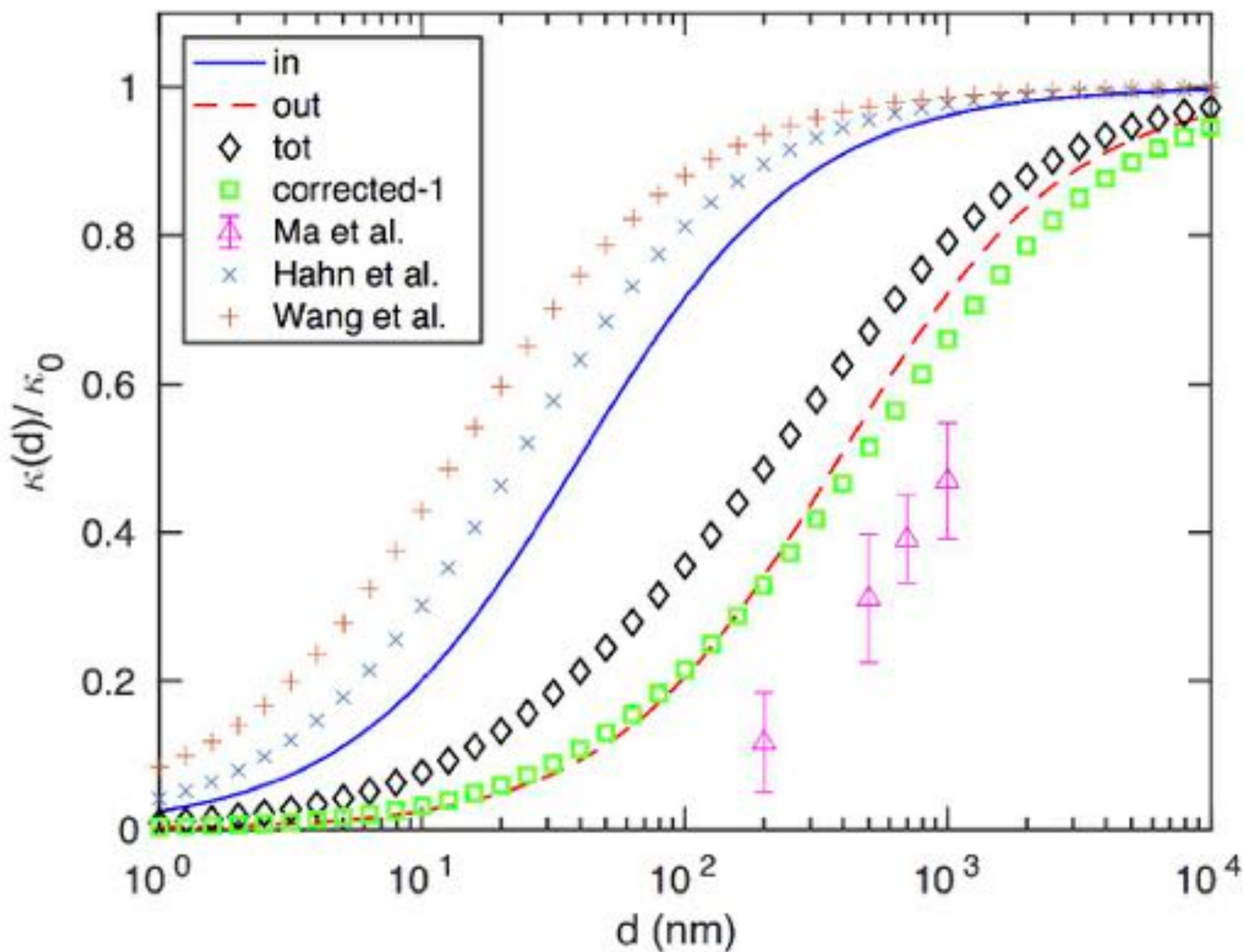
$$g_{A \rightarrow B}^{\text{in/out}}(\omega) = \frac{q_{A \rightarrow B}^{\text{in/out}}(\omega)}{S|\Delta T|}$$

[K. Sääskilahti *et al.*, AIP Adv. 6, 12190 (2016)]

❖ Quantum corrected by Bose-Einstein factor

$$L^{\text{in}} \approx 120 \text{ nm and } L^{\text{out}} \approx 800 \text{ nm}$$

Heat Conduction in Multigrain Flakes



Heat Conduction in Pristine Graphene

- ❖ For pristine graphene we find at $T = 300$ K (MD with opt. Tersoff)

$$\kappa_0^{\text{in}} \approx 800 \text{ Wm}^{-1}\text{K}^{-1} \text{ and } \kappa_0^{\text{out}} \approx 2100 \text{ Wm}^{-1}\text{K}^{-1}$$

$$\kappa_0 = \kappa_0^{\text{in}} + \kappa_0^{\text{out}} = 2900 \text{ Wm}^{-1}\text{K}^{-1}$$

Experimentally $\kappa_0 \approx 1500 - 2500 \text{ Wm}^{-1}\text{K}^{-1}$

Heat Conduction in Pristine Graphene

- ❖ For pristine graphene we find at $T = 300$ K (MD with opt. Tersoff)

$$\kappa_0^{\text{in}} \approx 800 \text{ Wm}^{-1}\text{K}^{-1} \text{ and } \kappa_0^{\text{out}} \approx 2\,100 \text{ Wm}^{-1}\text{K}^{-1}$$

$$\kappa_0 = \kappa_0^{\text{in}} + \kappa_0^{\text{out}} = 2\,900 \text{ Wm}^{-1}\text{K}^{-1}$$

Experimentally $\kappa_0 \approx \cancel{1500 - 2500} \text{ Wm}^{-1}\text{K}^{-1}$
 $5\,200 \text{ Wm}^{-1}\text{K}^{-1}$

Heat Conduction in Pristine Graphene

- ❖ For pristine graphene we find at $T = 300$ K (MD with opt. Tersoff)

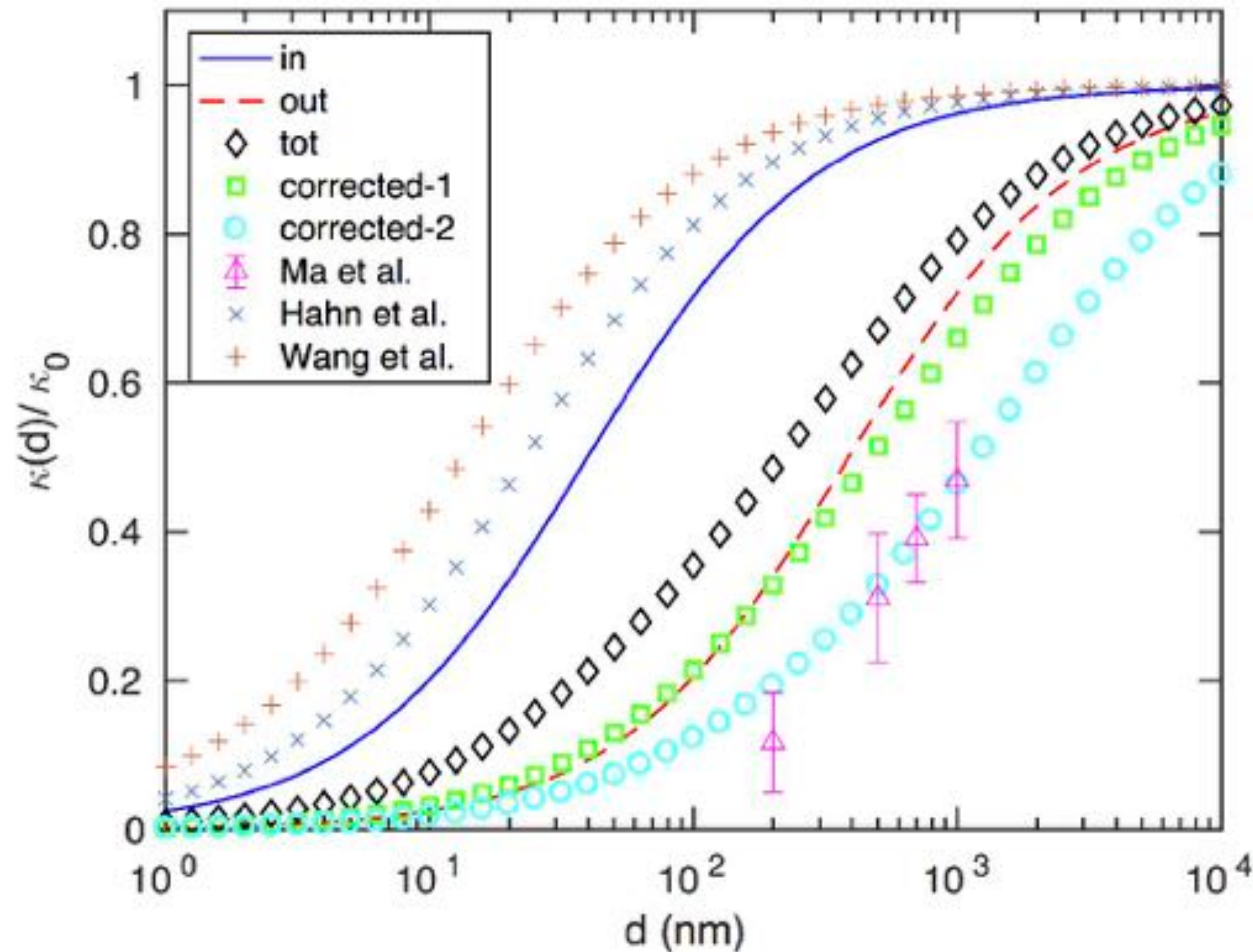
$$\kappa_0^{\text{in}} \approx 800 \text{ Wm}^{-1}\text{K}^{-1} \text{ and } \kappa_0^{\text{out}} \approx 2\,100 \text{ Wm}^{-1}\text{K}^{-1}$$

$$\kappa_0 = \kappa_0^{\text{in}} + \kappa_0^{\text{out}} = 2\,900 \text{ Wm}^{-1}\text{K}^{-1}$$

Experimentally $\kappa_0 \approx 5\,200 \text{ Wm}^{-1}\text{K}^{-1}$

Recent lattice dynamics calculations give $5\,450 \text{ W/mK}$ [Y. Kuang *et al.*, Int. J. Heat Mass Transfer **101**, 772 (2016)]

Heat Conduction in Multigrain Flakes



❖ Final estimates for the Kapitza lengths

$$L^{\text{in}} \approx 0.12 \mu\text{m} \text{ and } L^{\text{out}} \approx 2 \mu\text{m}$$

Summary and Conclusions

- ❖ Phase-field crystal models can be employed for a *quantitative description* of 2D grain boundaries in graphene by proper fitting of the elastic properties
- ❖ PFC models produce realistic 5 | 7 grain boundaries in most cases
- ❖ Large multigrain samples (microns in linear size) can be generated for MD relaxation in 3D and used for further investigations (thermal, mechanical and transport properties) - *thermal transport is controlled by flexural modes in pristine graphene and strongly affected by grains*
- ❖ *Quantum corrections need to be taken into account* both for pristine and multigrain graphene (because of high Debye temperature)

Kiitos - Thanks - Gracias - Obrigado - مریسی - 唔該

Petri Hirvonen (Aalto)

Mikko Ervasti (Aalto)

Ari Harju (Aalto)

Zheyong Fan (Bohai, China)



Ken Elder (Oakland, USA)



Khatereh Azizi (Tehran, Iran)

Morteza Jalalvand (IASBS, Iran)

S. Mehdi Vaez-Allaei (Tehran, Iran)



Matthew Seymour (McGill, Canada)

Nikolas Provatas (McGill, Canada)



Davide Donadio (UCD, USA)



Luiz Pereira (Natal, Brazil)

