



# GPU-Accelerated String Method for Defect Annealing in Copolymer Self-Assembly

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## Copolymer self-assembly

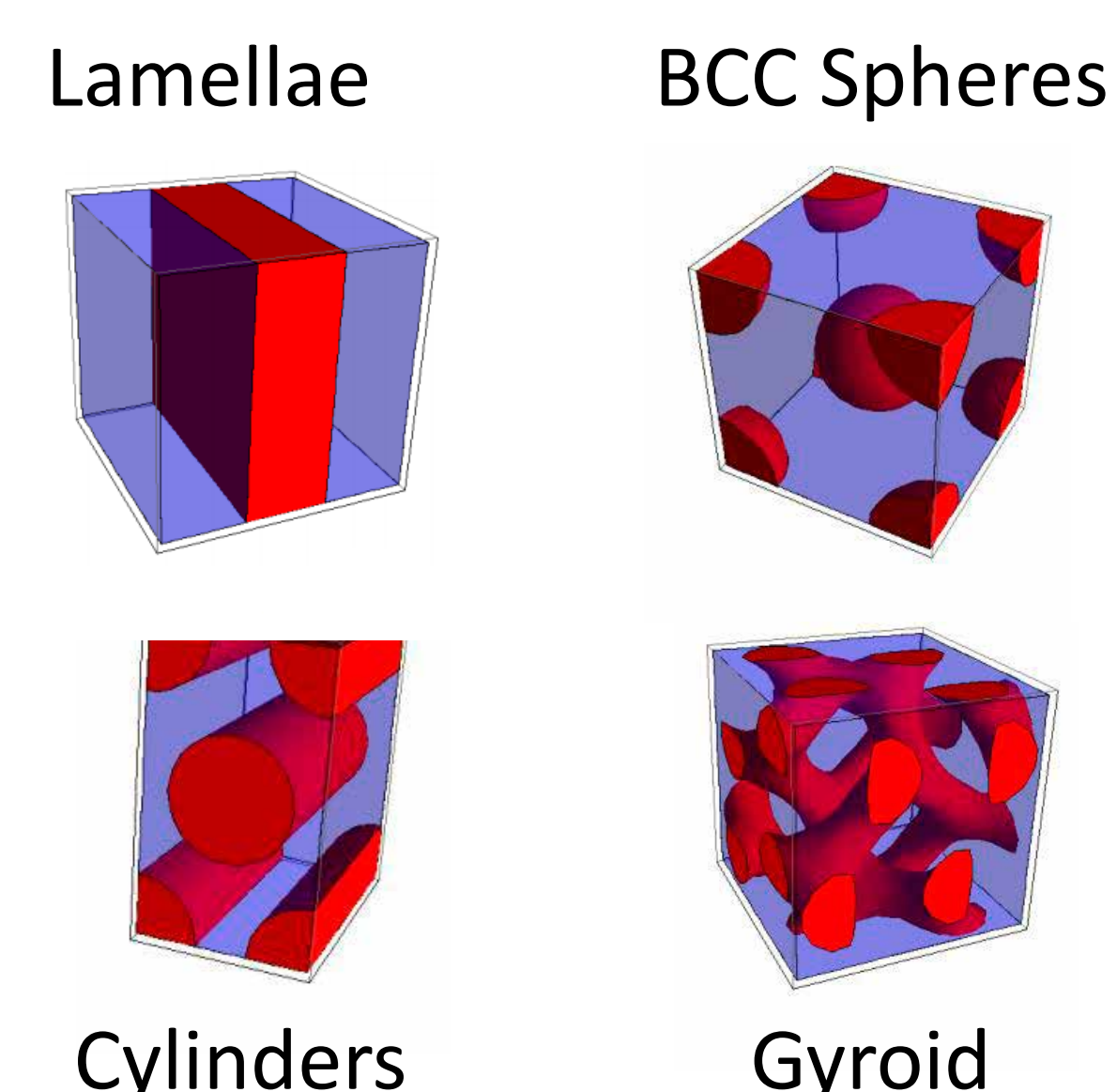
Diblock copolymer:  
2 tethered chains of chemically distinct monomers

AAAAABBBBB

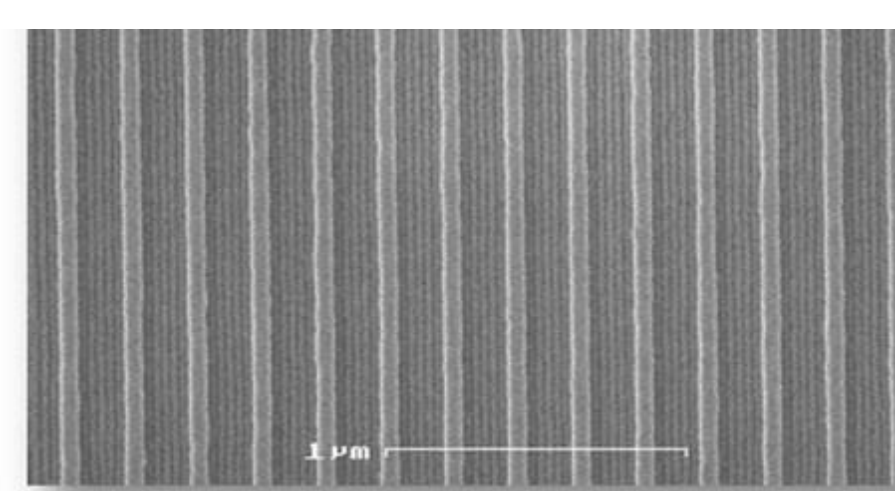
Block fractions  $f$   $1-f$

AA attract, BB attract, AB repel  
Effective interaction parameter  $\chi_{AB}$

Self-assemble into mesoscale structures



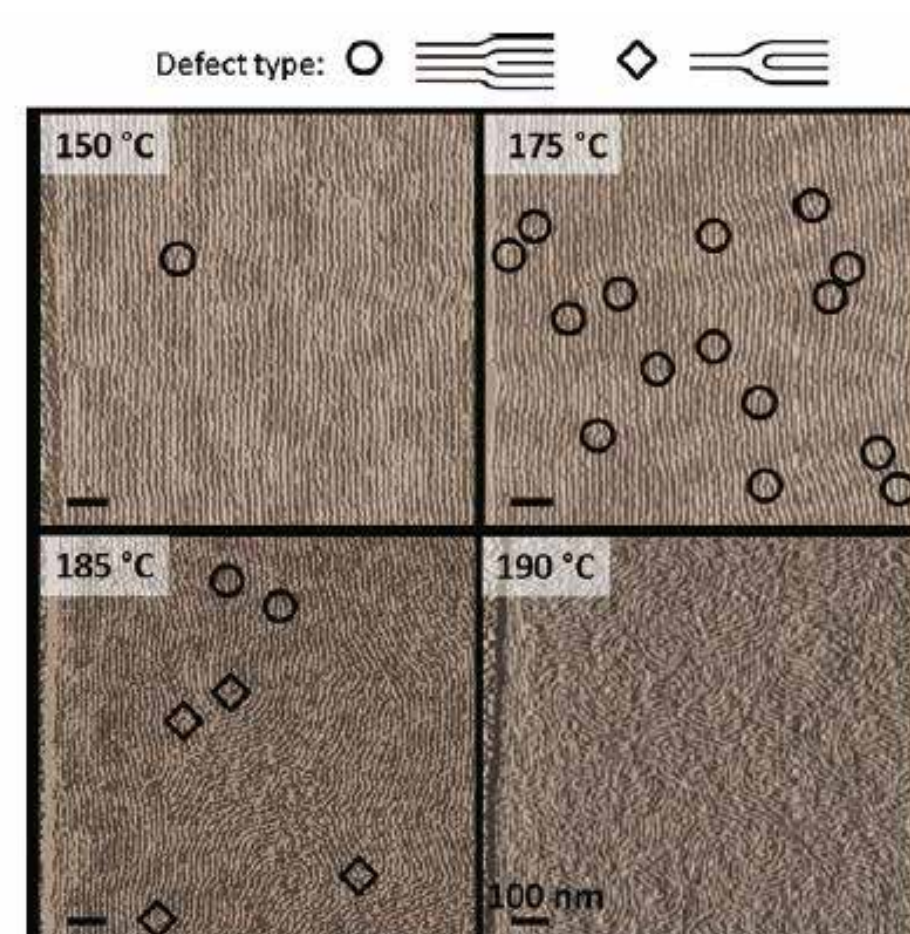
Significant, growing industrial interest



Cylindrical DSA- Courtesy of The Dow Chemical Company

- Nanolithography
- Filtration membranes

**Problem: Metastable defects**

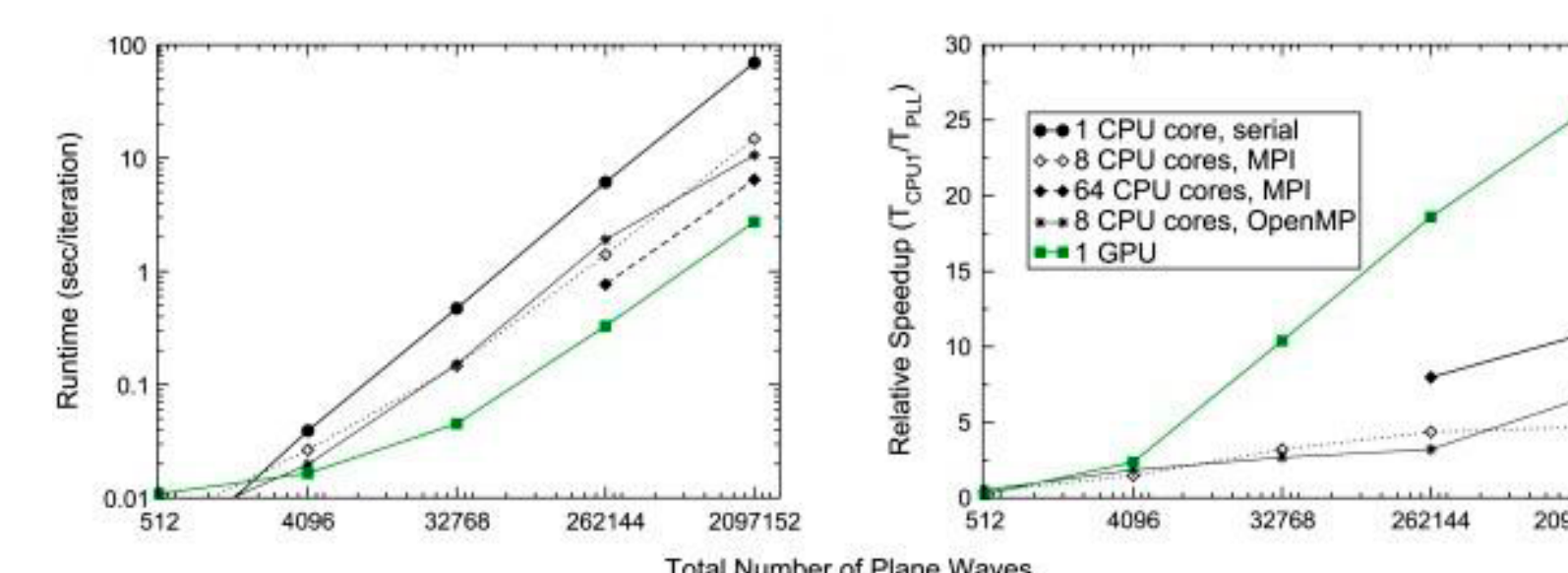


Experimental cylindrical DSA  
Dislocation (circle) and disclination defect (diamond) in PS-P2VP ( $f=0.23$ )  
V. Mishra, G. H. Fredrickson, and E. J. Kramer, *ACS Nano* 6, 2629 (2012)

## Implementation on single GPU

### SCFT Update

Relax fields with spectral methods  
Involves FFTs (use cuFFT) and elementwise field arithmetic. Good for GPU!

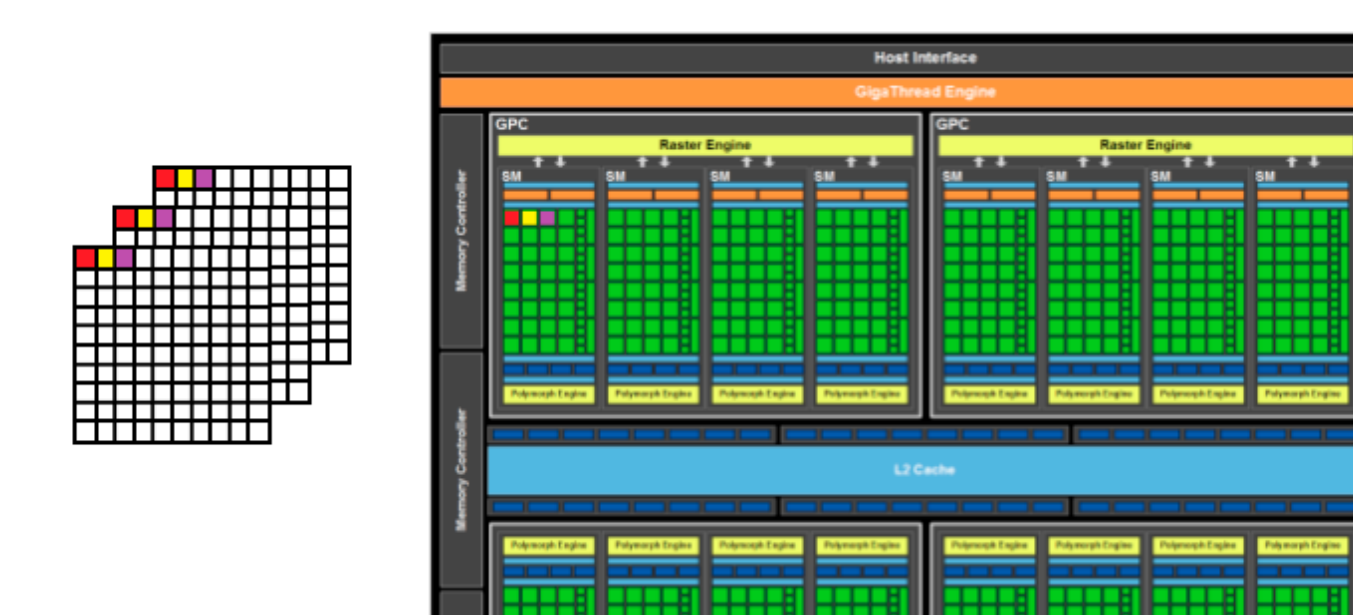


K. T. Delaney, G. H. Fredrickson, *Computer Physics Comm.* 184, 2102-2110 (2013)

Caveat: Update step parallel over *images*, suggests multi-GPU treatment. Stay tuned...

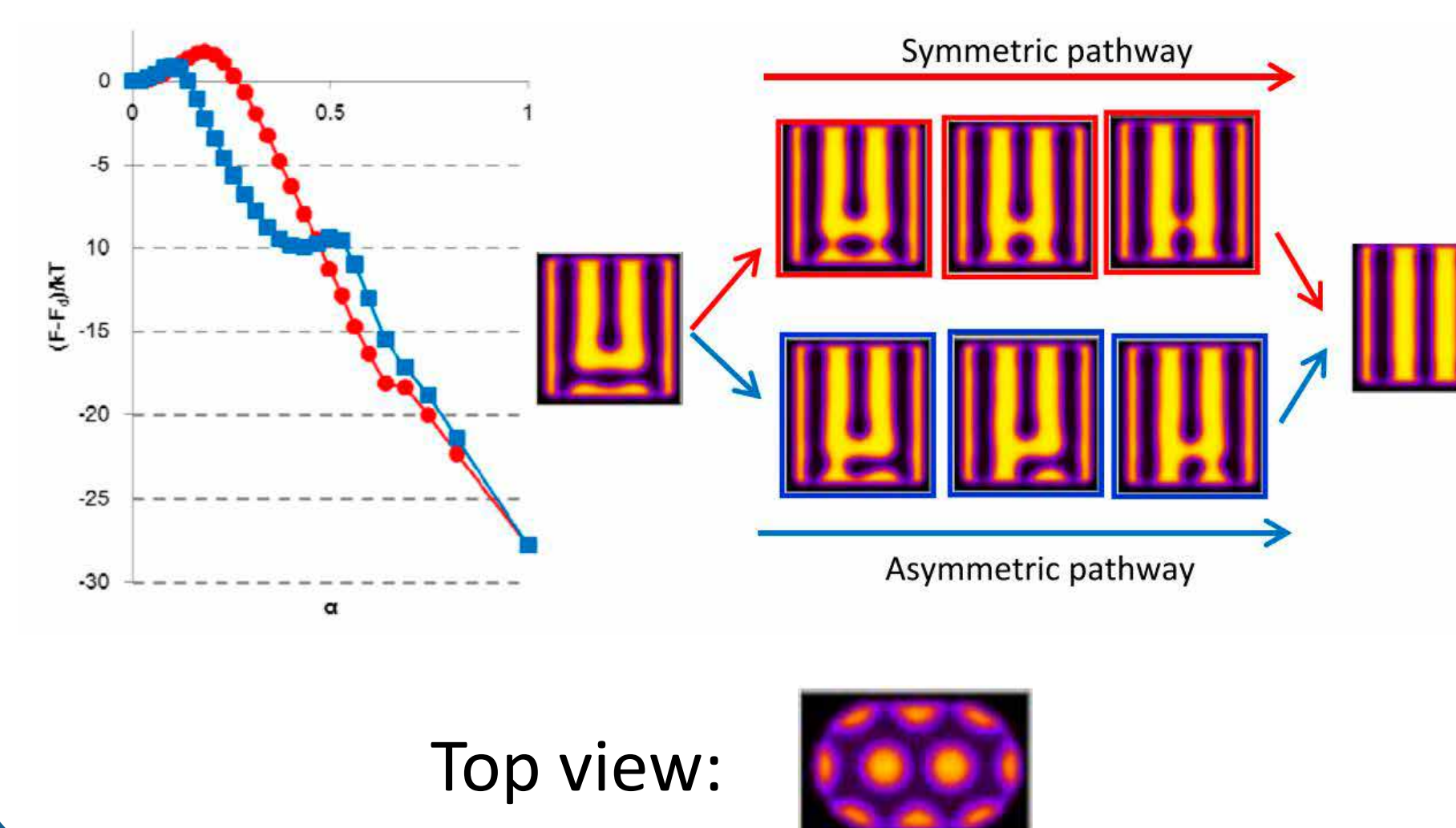
### Interpolate and Reparametrize

Parallel over approx.  $10^6$  grid points



Each core constructs and evaluates spline for 1 grid point, compute-heavy kernel hides latency

## Results



Example calculation: annealing of disclination defect for cylinders in cylindrical confinement. 2 annealing pathways found: symmetric and asymmetric.

T. Iwama, N. Laachi, K. T. Delaney, B. Kim, M. Carilli, G. H. Fredrickson, *Macromolecules* 2015, submitted

## Tool #1: Self-consistent field theory (SCFT)

Field-based model of monomer densities

$$\omega_A = i\omega_+ - \omega_-, \quad \omega_B = i\omega_+ + \omega_-$$

Integrate along chain contour to compute propagator  $q$

$$\frac{\partial}{\partial s} q(\mathbf{r}, s; [\omega_A, \omega_B]) = \frac{[\phi(s)]^2}{6} \nabla^2 q(\mathbf{r}, s) - \omega(\mathbf{r}, s) q(\mathbf{r}, s)$$

Integrate  $q$  over space for single-chain partition fn  $Q$

$$Q[\omega_A, \omega_B] = \frac{1}{V} \int d\mathbf{r} q(\mathbf{r}, N; [\omega_A, \omega_B])$$

$$H[\omega_+, \omega_-] = \rho_0 \int d\mathbf{r} [(1/\chi_{AB})\omega_-^2 - i\omega_+] - n \ln Q[\omega_A, \omega_B]$$

Update step  $\frac{\partial \omega_-}{\partial t} = \frac{\delta H}{\delta \omega_-}$  Relaxes to saddle point  $\frac{\delta H[\omega_+, \omega_-^*]}{\delta \omega_-} = 0$

$$\frac{\partial \omega_+}{\partial t} = \frac{\delta H}{\delta \omega_+} \quad \frac{\delta H[\omega_+, \omega_-^*]}{\delta \omega_+} = 0$$

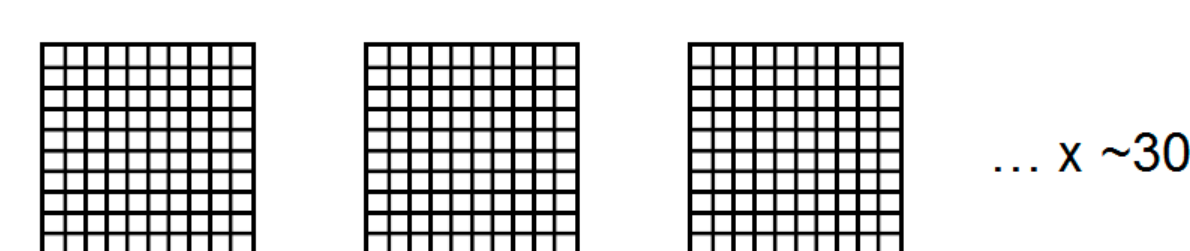
Saddle point approximation:  $Z \approx Z_0 e^{(-H[\omega_+, \omega_-^*])}$

$$\rho_A(\mathbf{r}; [\omega_A, \omega_B]) = -n \frac{\delta \ln Q[\omega_A^*, \omega_B^*]}{\delta \omega_A}$$

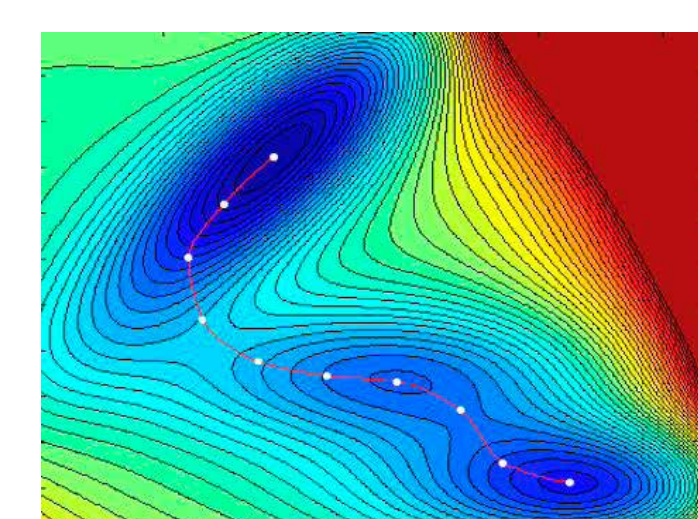
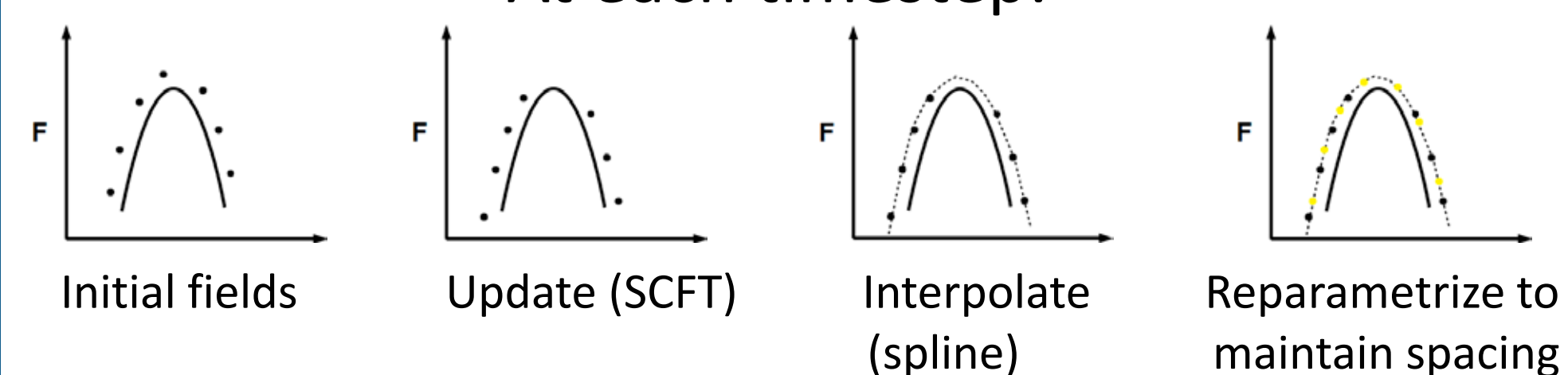
$$\rho_B(\mathbf{r}; [\omega_A, \omega_B]) = -n \frac{\delta \ln Q[\omega_A^*, \omega_B^*]}{\delta \omega_B}$$

## Tool #2: String Method

For barrier crossing in high-dimensional systems  
Compatible with SCFT  
Operates on sequence ("string") of models ("images")



At each timestep:

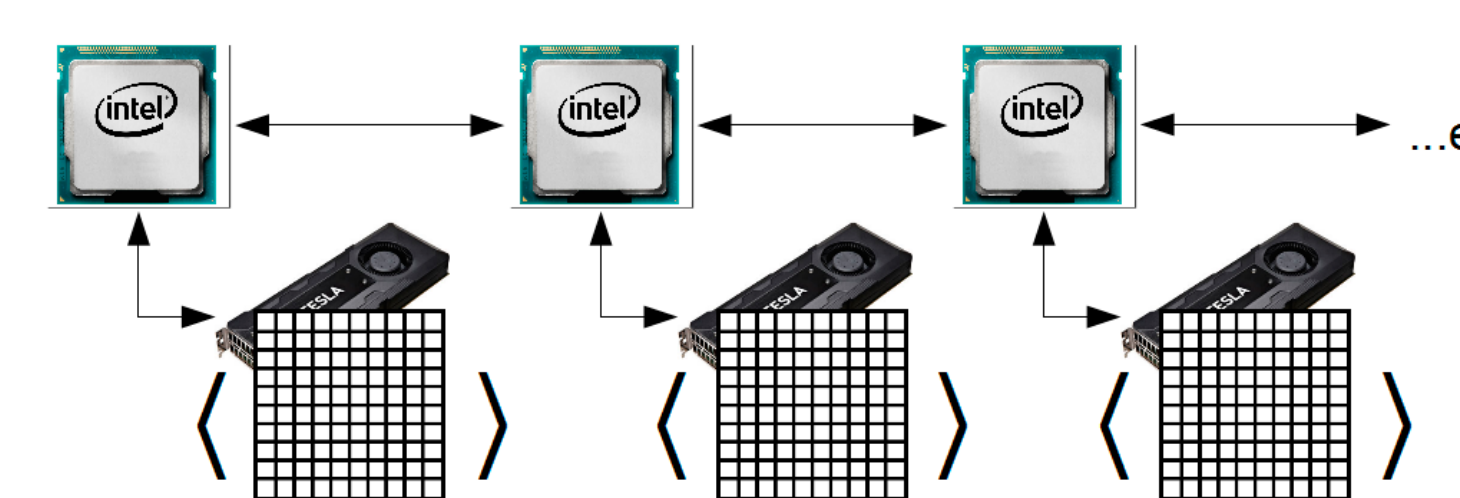


Converges to minimum energy path (MEP)  
"Mountain pass." Good estimate of transition path

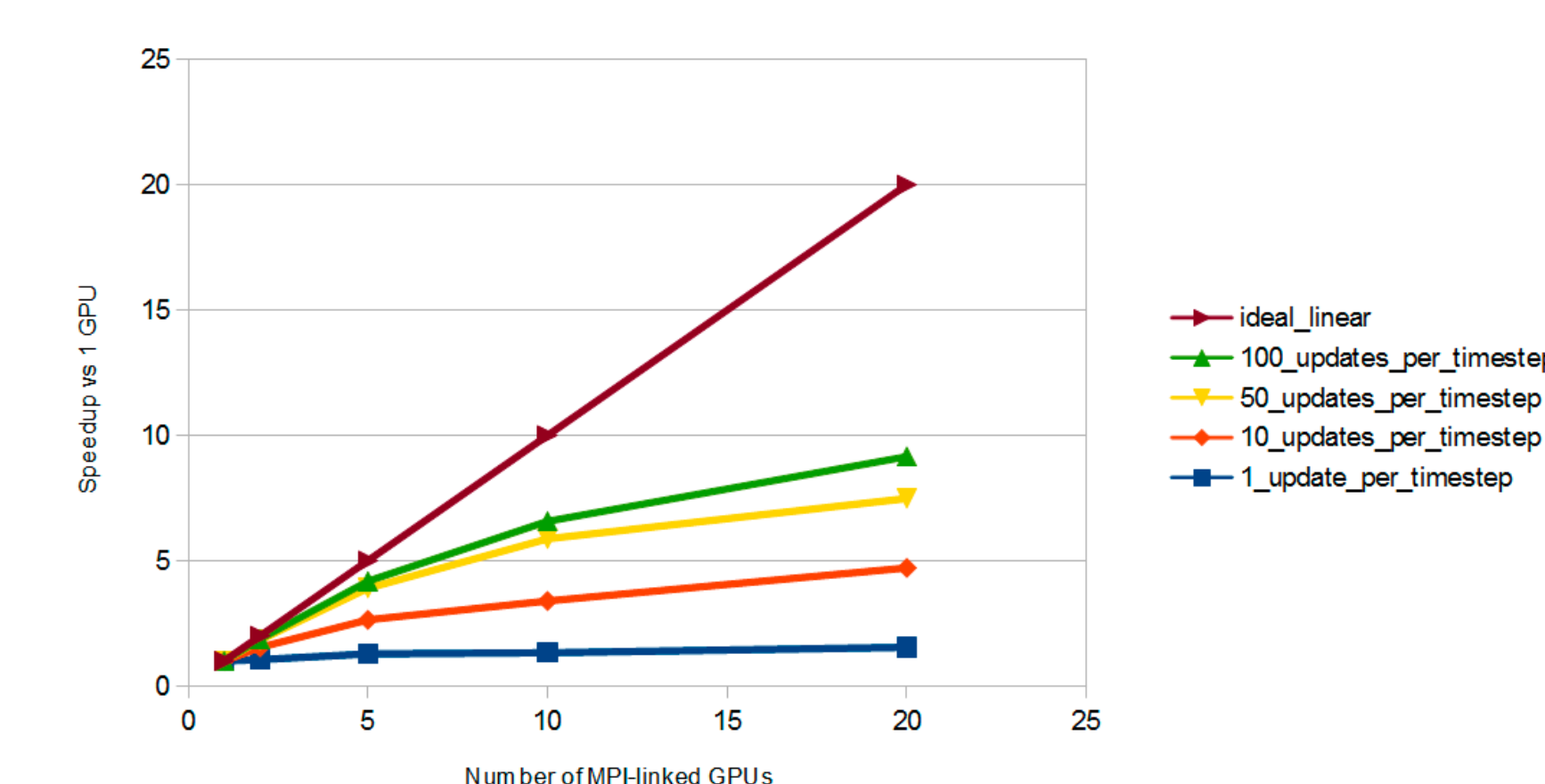
2D illustration: <http://www.cims.nyu.edu/~eve2/string.htm>

## Current work: MPI-GPU Finite Temperature String

Finds *free energy* barrier (fluctuations included)  
Requires thermal average at each timestep  
(100+ updates per image per reinterpolate step)



Parallelize averaging step over multiple GPUs;  
scaling improves as number of update steps used in thermal average increases



Strong scaling attained around 100 thermal average steps per reinterpolate step

(Scaling data collected on the TACC's Maverick)