# Parallel Kinetic Monte Carlo for Crystal Surface Diffusion

Anya Katsevich and Terrence Alsup

May 20, 2019

## Crystal Surface Jump Process

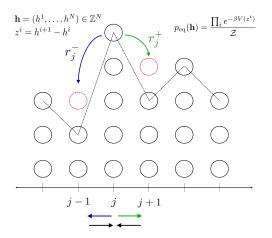


Figure: Surface diffusion on 1D lattice; an event occurs at site j when the topmost atom jumps left or right, at a rate of  $r_i^{\pm}$ .

## Scaling Limit of Process

Re-scale the height, domain, and time as

$$h(x,t)=\frac{1}{L}h_{\lfloor Lx\rfloor}(L^4t).$$

As  $L \to \infty$  the continuous height profile h(x, t) will satisfy the following PDE describing the evolution of h:

$$\partial_t h(t,x) = -\frac{K}{2} \partial_{xxx} \left[ \sigma_F \left( \partial_x h(t,x) \right) \right],$$

where  $\sigma_F$  is the free energy of the surface [1].

# Serial KMC Description

Input: Initial lattice state  $\vec{h}$  and time t=0

While t < T do

- For the given state  $\vec{h}$ , compute the current values of all rates,  $r_i$ , of events  $E_i$ .
- ② Draw a waiting time  $\Delta t \sim \operatorname{Exp}(R)$  for the next event to occur  $(R = \sum_i r_i)$  and update the time  $t \mapsto t + \Delta t$ .
- **3** Draw an event E from the discrete distribution  $\mathbb{P}(E_i) = \frac{r_i}{R}$  and update the state.

## Parallel KMC Description

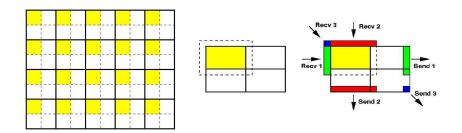


Figure: A processor works on the yellow section of its block, then sends and receives boundary information from other processors before moving on to work on the next section [2]

## Parallel KMC Description

#### MPI Implementation of [2], [3]

Input: current physical time t, current values of  $R_{\max}^{0,1}$ ,  $t_{\text{stop}}$ , and current crystal state  $\vec{h}_k(t)$  known to processor k.

- **9** Run **Serial KMC** until time  $t = t + t_{\text{stop}}$  in the left section of the block (updating rates after each event).
- Send left bdy info and receive right bdy info (MPI\_Send, MPI\_Recv)
- lacktriangle Compute the new value of  $R^1_{
  m max}$  (using MPI\_Allreduce) and  $t_{
  m stop}$ .
- Repeat Steps 1-3 for the right section.

## Performance: Accuracy

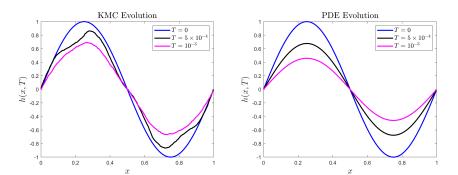


Figure: Evolution of crystal surface simulated with parallel KMC simulation (left) compared to evolution of PDE solution (right) for initial condition  $h(x) = \sin(2\pi x)$ .

7 / 12

## Performance: Accuracy

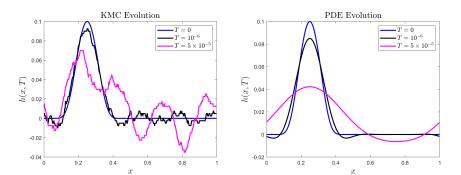


Figure: Evolution of crystal surface simulated with parallel KMC simulation (left) compared to evolution of PDE solution (right) for initial condition with compact support.

#### Performance: Theoretical Analysis

#### **Strong Scaling**

	Complexity
1 processor:	
Computational effort / event	O(L)
Total computational effort	$O(L) \times \#$ Events.
P processors:	
# Events/ processor	$\frac{1}{P} \times \#$ Events
Computational effort / event	$\left  \begin{array}{l} rac{1}{P} \times \# \text{ Events} \\ O(L/P) \end{array} \right $
Total computational effort / processor	$\frac{1}{P^2} \times O(L) \times \#$ Events

**Table** 

**Weak Scaling**: Poor because of  $T \sim P^4$  scaling.

## Performance: Experiments

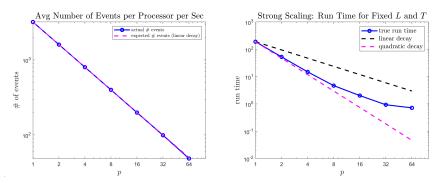


Figure: Strong scaling algorithm performance (left), and number of events per processor per second (right). and. Note that the run time decreases faster than linearly as the number of processors increases. This is because both the number of events and the computational effort per event decreases linearly as the number of processors increases.

#### Conclusion

- Serial KMC has same behavior as PDE only for large *L*, and parallel algorithm is approximation to serial one.
- No known error bounds for parallel approximation; unclear if parallel simulation reliable for small L.
- Good strong scaling ( $P^2$  speedup) but poor weak scaling.





I. Martin-Bragado, J. Abujas, P.L. Galindo, J. Pizarro *Synchronous* parallel Kinetic Monte Carlo: Implementation and results for object and lattice approaches, Nuclear Instruments and Methods in Physics Research B, 352 (2015) 2730