

# Asynchronous Event-Driven Particle Algorithms in Computational Materials Science

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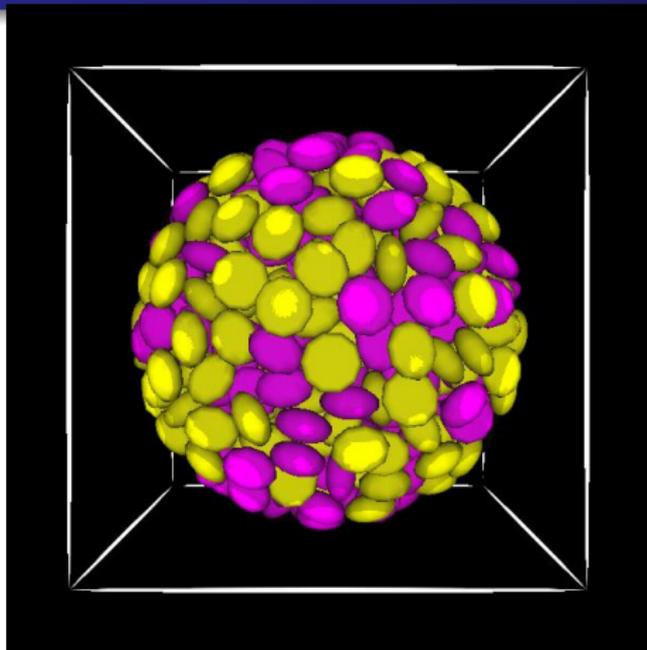
Scientific Computing and Advanced Computation  
Joint Mathematics Meeting, January 2009

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<sup>1</sup>This work performed under the auspices of the U.S. Department of Energy by Lawrence Livermore National Laboratory under Contract DE-AC52-07NA27344 (LLNL-PRES-408395).

- 1 Introduction
- 2 Molecular Dynamics: Packing of Hard Particles
- 3 First-Passage Kinetic Monte Carlo: Diffusion-Controlled Reactions

# Packing of M&Ms



(MNG)(MPEG)

*Improving the Density of Jammed Disordered Packings using Ellipsoids*, **Science**, 2004

A. Donev, I. Cisse, D. Sachs, E. A. Variano, F. H. Stillinger, R. Connelly, S. Torquato and P. M. Chaikin

# Time-Driven (TD) Molecular Dynamics

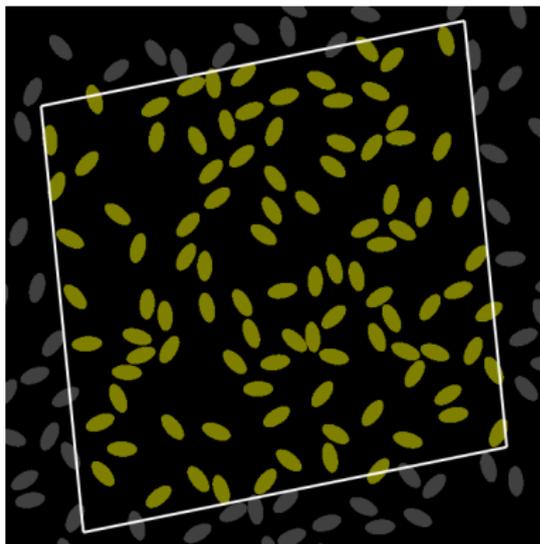
*Time-Driven Molecular Dynamics* (TDMD) for soft particles (ODE integrators):

- 1 All of the particles are displaced *synchronously* in small *time steps*  $\Delta t$ , calculating positions and forces on each particle at every time step.
- 2 It is *not* rigorous (there is an error  $\sim \Delta t$ ), but it is very well-understood and widely implemented.
- 3 Discontinuous changes of the state, aka events, occur *a posteriori*, in the middle of time steps (e.g., chemical reactions).

# Asynchronous Event-Driven (AED) Algorithms

- *Event-Driven Molecular Dynamics* (EDMD) for hard particles:
  - Time is advanced from one *event* to the next event.
  - *Asynchronous*: Each particle is at the point in time when the last event involving it happened.
  - Given infinite numerical precision, this kind of approach can *rigorously* follow the dynamics of the system.
- Note: There also exist **synchronous** event-driven algorithms, for example, dynamic Markov chain Monte Carlo algorithms.
- Asynchronous event-driven algorithms naturally handle **variable time-scales**.

# Molecular Dynamics (MD) Algorithm



- Event-driven MD (**EDMD**) packing algorithm *ala* **Lubachevsky-Stillinger**
- The very first MD simulations (Alder & Wainwright) were event-driven hard-disk MD!
- Non-spherical particles are much more difficult to handle than spheres (collision prediction).

(MNG)(MPEG)

*Neighbor List Collision-Driven Molecular Dynamics Simulation for Nonspherical Particles*

A. Donev, F. H. Stillinger, and S. Torquato, **J. Comp. Phys**, 2005

# Basic Algorithm

- Each particle has its own *current time*  $t$  predicts its *impending event*  $(t_e, p_e)$ .
- Types of events: *binary collision*, boundary events, internal events, geometrical events, etc.
- Each particle  $i$  predicts events with particles and objects in its *neighbourhood*  $\mathcal{N}(i)$ .
- *Collision predictions* must be kept symmetric, that is, if  $i$  predicts an event with  $j$ , it changes  $j$ 's prediction as well.
- *Event schedule* consists of a *priority queue* of time-ordered impending events, one for each particle.

# Event Loop

- 1 Delete (pop) the top of the event queue (heap) to find the next particle  $i$  to have an event with  $p_e(i)$  at  $t_e(i)$ .
- 2 Advance the global simulation time  $t \leftarrow t_e(i)$ .
- 3 Move  $i$  to time  $t$ ,  $\mathbf{r}(i) \leftarrow \mathbf{r}(i) + [t - t(i)] \mathbf{v}_i$ , and set  $t(i) \leftarrow t$ , if necessary.
- 4 If  $p_e(i) \equiv \mathcal{N}(i)$ , then update  $\mathcal{N}(i)$ .
- 5 If event is a wall collision, process the collision (update the momentum of  $i$ ).
- 6 If event is a binary collision, then:
  - 1 Move particle  $j = p_e(i)$  to time  $t$  and set  $t(j) \leftarrow t$  and mark  $j$ 's event as an update.
  - 2 Process the binary collision between  $i$  and  $j$ .
- 7 *Critical*: Predict the next event for particle  $i$ , checking for collisions with walls and particles in  $\mathcal{N}(i)$ .
- 8 Insert particle  $i$  back into the event heap with key  $t_e(i)$ .

# Neighbour Search

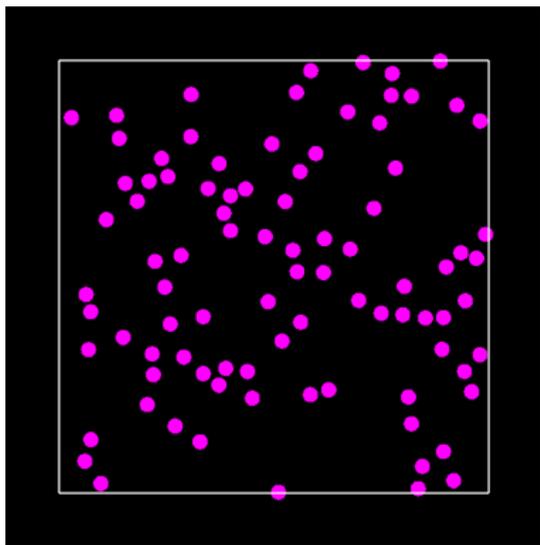
The **Linked-List Cell** method:

- 1 Partition the simulation domain into cells, and bin the particles into the bins based on *centroid* position.
- 2 Cell partitioning is *independent* of the particle motion.
- 3 *Transfer* events monitor centroids.

The **Near-Neighbor List** (NNL) method:

- 1 Each particle has its *bounding neighborhood*: region of space where interacting particles may be present.
- 2 Each particle has a *list of neighborhoods* its bounding neighborhood overlaps with.
- 3 Use the cell partitioning when building the NNLs.

# Diffusion Kinetic Monte Carlo

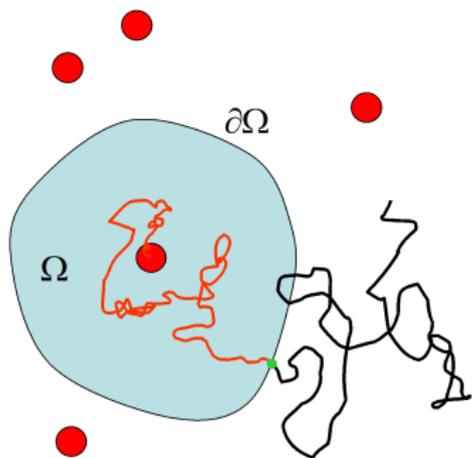


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- Some or all unit events are diffusion hops: a set of  $N$  hard objects walking randomly on a lattice or in continuum space.
- Upon collision particles *react* (**collision events**).
- Example: Diffusion-controlled annihilation  $A + A \rightarrow 0$ .
- Great many diffusion hops necessary to bring particles to collisions at low density.

Traditional *synchronous*  $n$ -fold event-driven algorithm (BKL). Other types of Poisson events (birth, decay, boundary, etc.) are easy to handle.

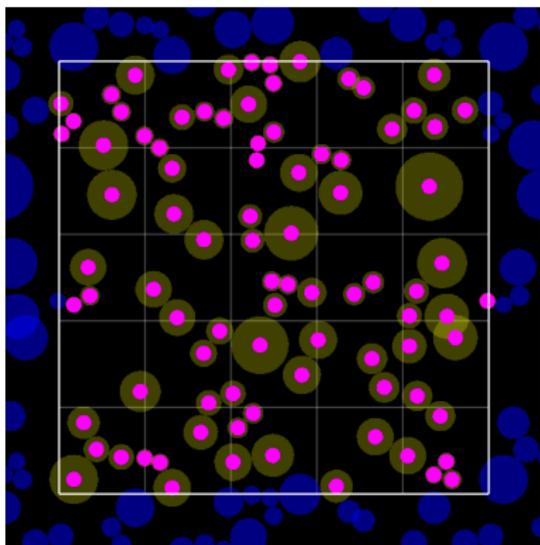
# Green's Function First-Passage Diffusion Theory



- Given a region of space  $\Omega$ , one can determine the probability distributions for when and where (on  $\partial\Omega$ ) a particle will first leave that region (*first-event prediction*).
- Given that a particle has not yet left that region, one can determine the probability of finding the particle at some point inside the region at a given time (*no-event propagation*).

For pairs of particles, reduce to two *independent* **center-of-mass** and **difference walkers**.

# Event-Driven: First Passage



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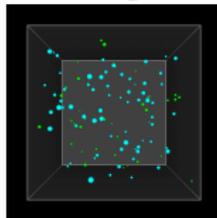
- Construct disjoint protective regions (cubes, spheres) at  $t = 0$ .
- Main events are **(super)hops** to  $\partial\Omega$ . For each walker (particle or pair) **randomly** draw first passage time from the appropriate PDF (thus MC).
- Find the earliest time in the queue, propagate the particle/pair to boundary/collision, construct a new protective region, insert back into queue with a new event time, repeat!

*First-passage Monte Carlo algorithm: Diffusion without all the hops*, **PRL**, 2006

T. Opelstrup, V. V. Bulatov, George H. Gilmer, M. H. Kalos, and B. Sadigh

# Advantages of the Algorithm

- The algorithm is **exact** for continuous diffusion problems.
- It is the first use we know of of **time-dependent Green's functions**.
- The algorithm automatically adjusts to variable timescales: **multiscale**.
- We have a code that implements different types of reactions (annihilation, coalescence, chemical reactions, decay/emission, hard-sphere repulsion).
- Used for modeling **radiation damage in metals**: diffusing and reacting vacancies and interstitials (defects created by radiation)



# Disadvantages of the Algorithm

- The method is significantly more **complicated** to implement than BKL KMC and it requires analytical solutions (1-body and 2-body problems).
- Multi-particle reactions cause complications or slowdown (ex., nearly triple collisions).
- One can combine the asynchronous super-hops with local synchronous small hops in a **mixed time-driven/event-driven approach** (under development).
- See Stochastic Molecular Dynamics algorithm in "**Asynchronous Event-Driven Particle Algorithms**", by A. Donev, to appear in *Simulation: Transactions of the Society for Modeling and Simulation International*, 2009, [arxiv.org/cs.0H/0703096](http://arxiv.org/cs.0H/0703096).

# Conclusions

- Event-driven algorithms are a *very efficient alternative* to traditional time-driven simulations in situations where the evolution of a system is dominated by **discontinuous state changes** (events).
- ED algorithms are significantly **more complicated** than TD ones and work best for simple models such as hard-particle systems.
- Time-driven and event-driven handling can be *combined* together: each piece does what it is best for!
- Unfortunately, event-driven algorithms are *not* widely used and most computational scientists are not familiar with them.
- AED algorithms are very **difficult to parallelize!**