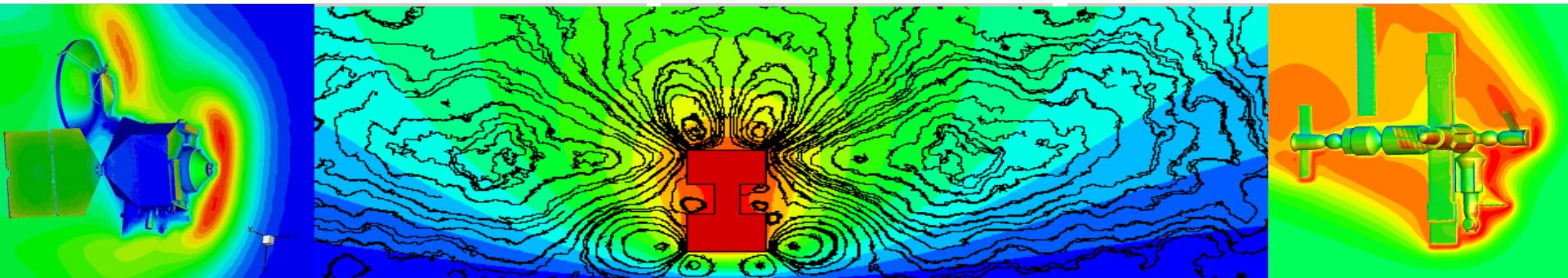


*Exceptional service in the national interest*



# Stochastic PArallel Rarefied-gas Time-accurate Analyzer

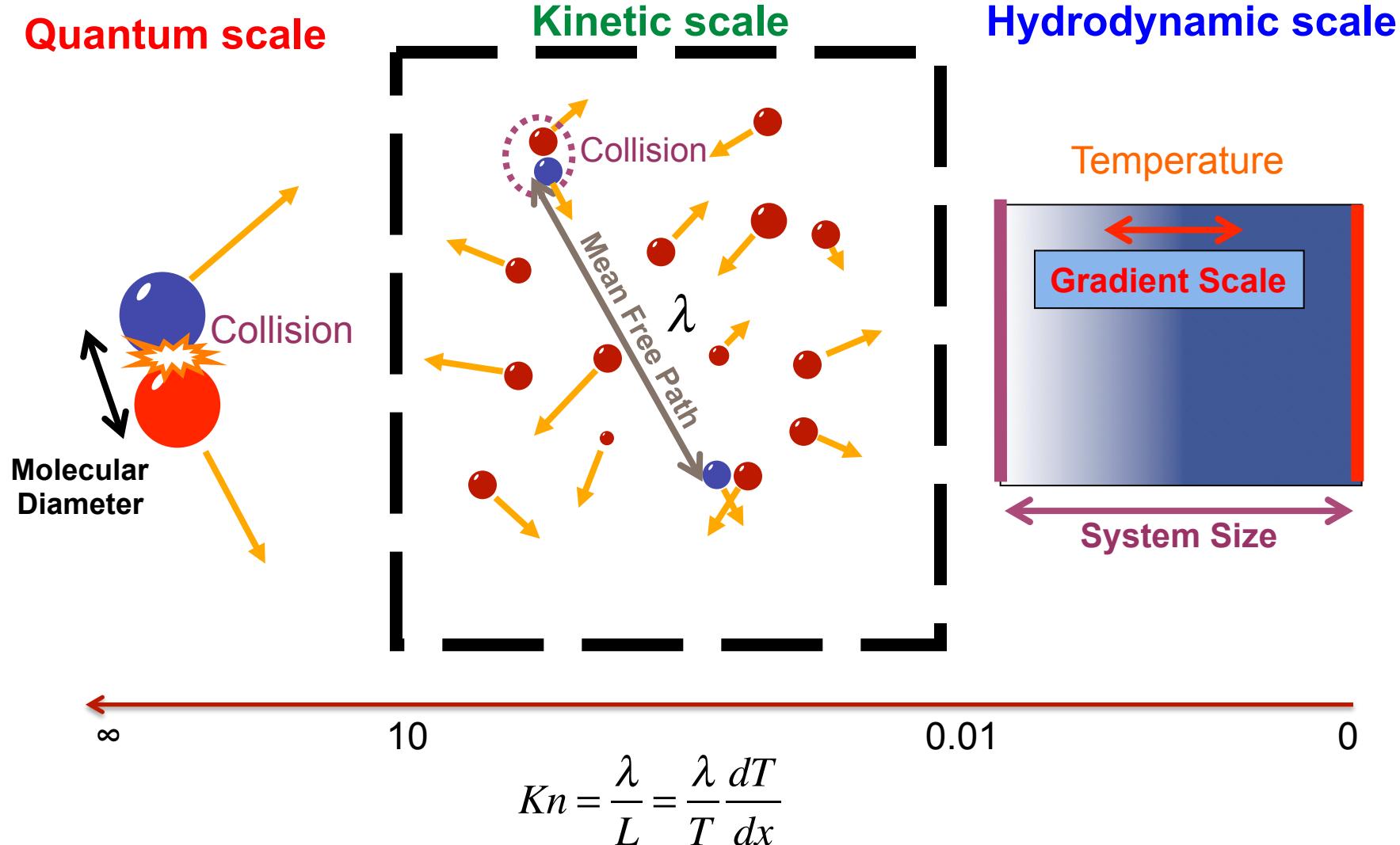
*Michael A. Gallis*

Engineering Sciences Center  
Sandia National Laboratories  
Albuquerque, New Mexico, USA



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# Length Scales for Dilute Gases



# Direct Simulation Monte Carlo

## How DSMC works

DSMC molecule-simulators **statistically** represent a large number of real molecules ( $O(10^{10})$ - $O(10^{15})$ )

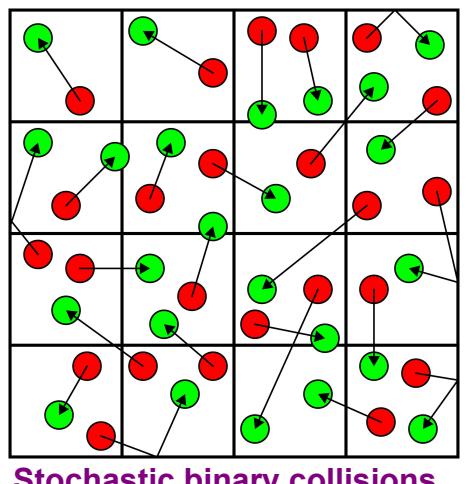
Computational molecules move ballistically, collide statistically, and interact statistically with surfaces **like real molecules**

Molecular movement, surface-interaction, and collision are implemented **sequentially** in the algorithm

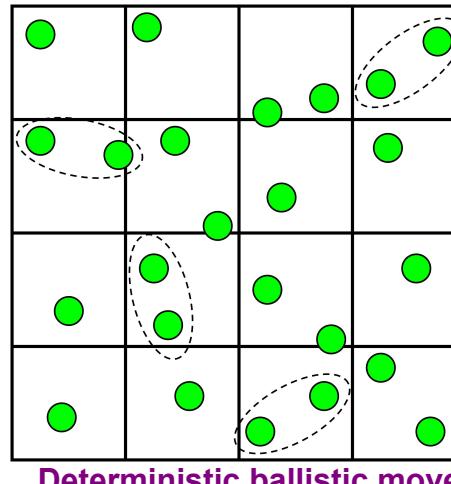
Cell-based molecular statistics (“moments”) are sampled and averaged over many time steps for steady flow

## DSMC is inherently a transient method

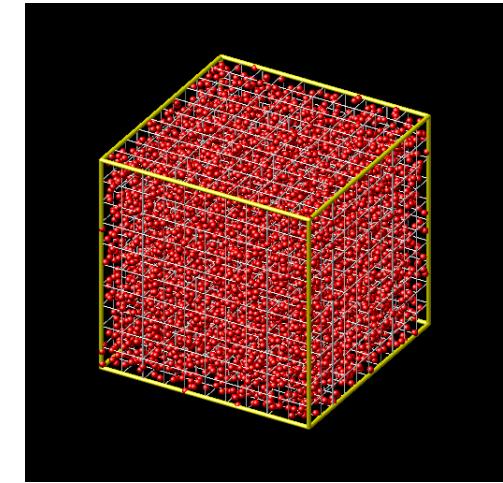
Steady state is the ensemble average of unsteady state moves



+



=

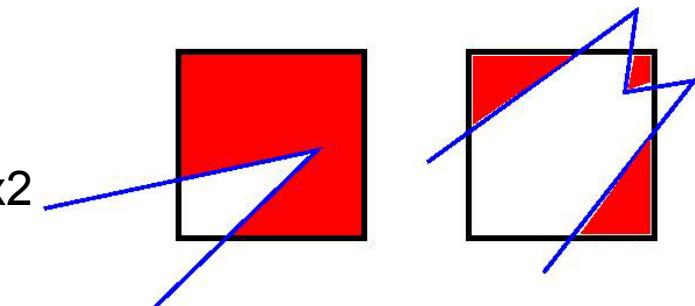


# Developing an Exascale DSMC Code

**SPARTA** = Stochastic PArallel Rarefied-gas Time-accurate Analyzer

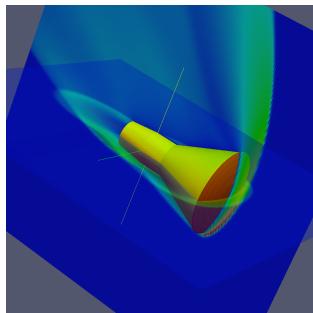
## General features

- 2D or 3D, serial or parallel
- Cartesian, hierarchical grid
  - Oct-tree (up to 16 levels in 64-bit cell ID)
  - Multilevel, general  $N \times M \times L$  instead of  $2 \times 2 \times 2$
- Triangulated surfaces cut/split the grid cells
  - 3D via Schwartzentruber algorithm
  - 2D via Weiler/Atherton algorithm
  - Formulated so can use as kernel in 3D algorithm
- C++, but really object-oriented C
  - Designed to be easy to extend
  - New collision/chemistry models, boundary conditions, etc.
- Code available at <http://sparta.sandia.gov>

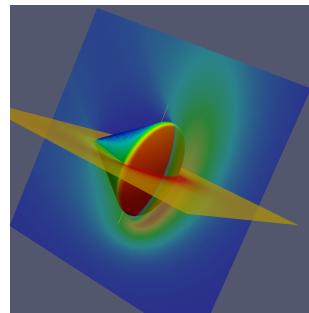


# Earth Return Vehicles

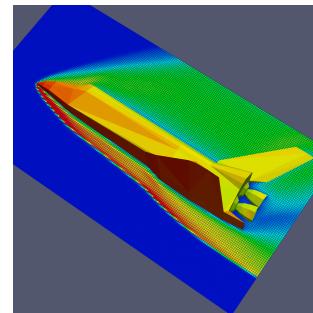
Gemini  
1961-1966



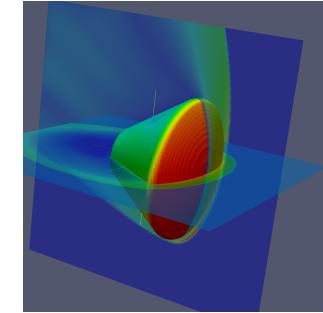
Apollo  
1963-1972



Space Shuttle  
1981-2011

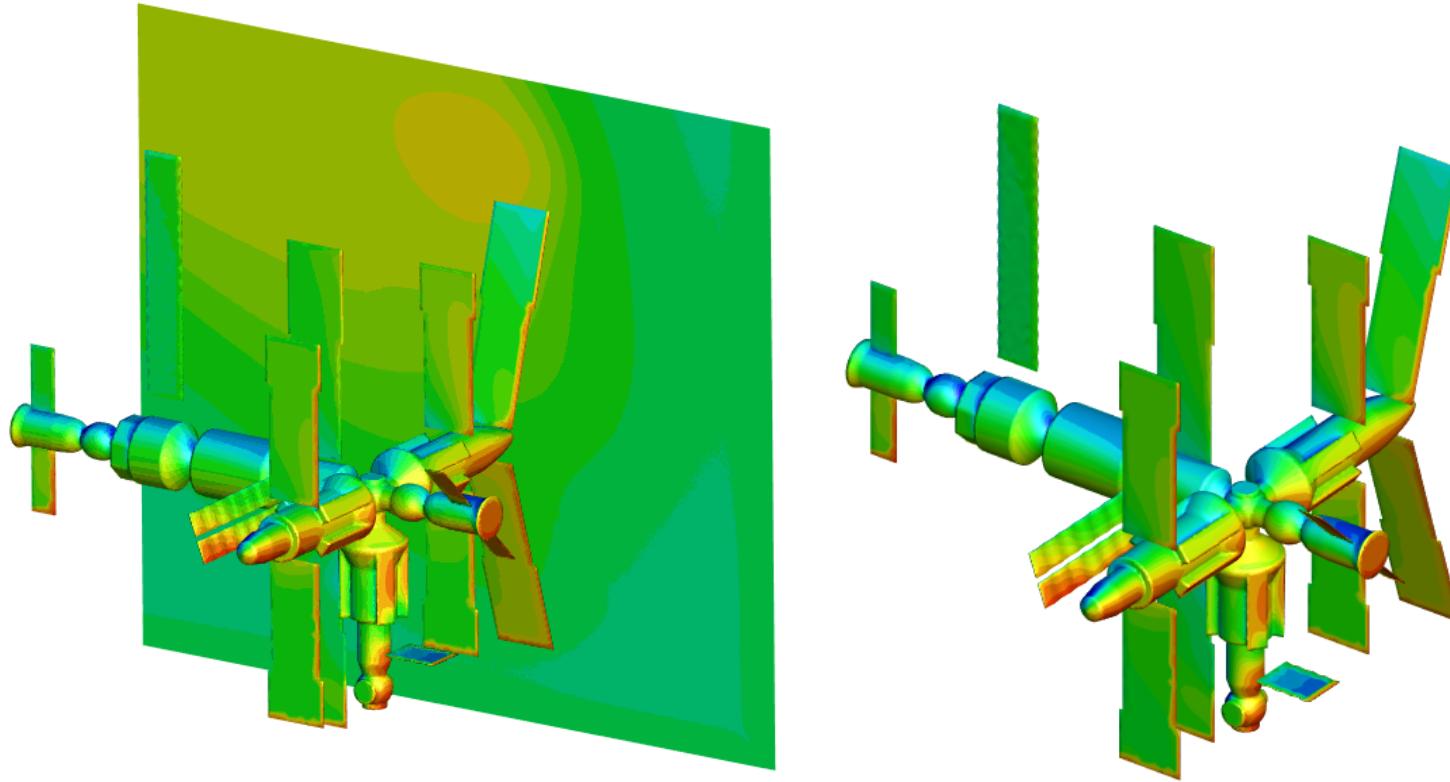


Orion  
2014-?



- Atmospheric entry system must provide controlled dissipation of kinetic and potential energy of the vehicle.
- Dynamic and thermal loads must be kept within certain range

# Simulation of Complicated Shapes



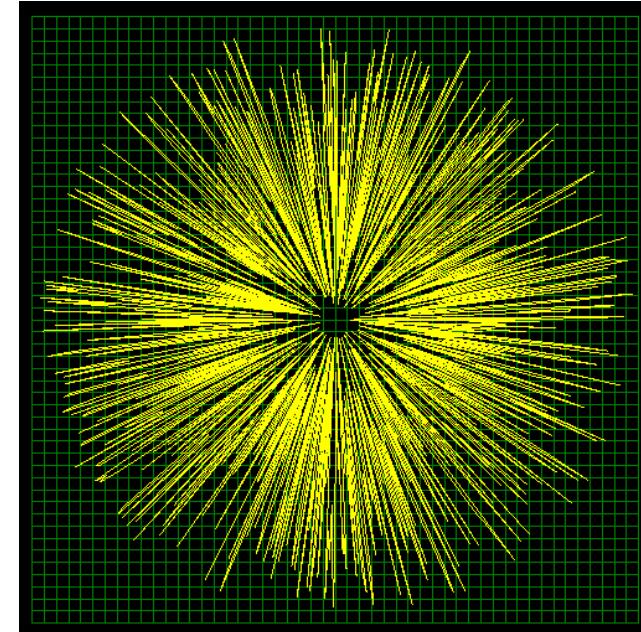
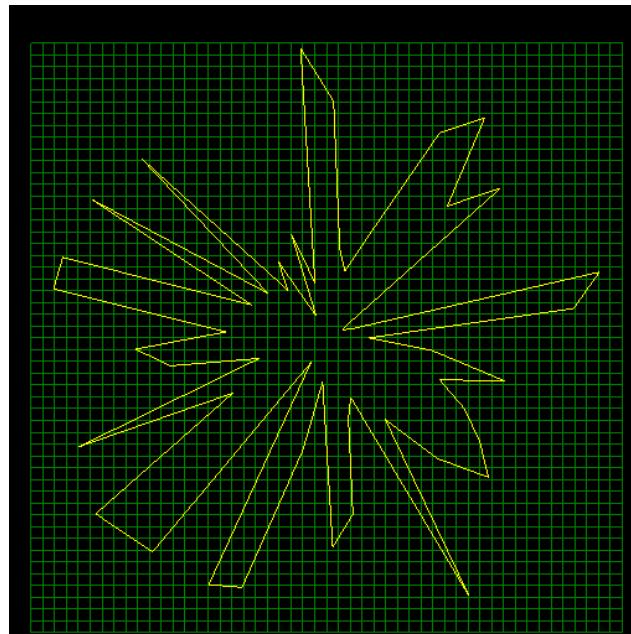
Mir Space Station

Grid generation ( $10^7$  cells) completed in 0.3 seconds on 16 processors  
Geometry comprises multiple “water-tight” bodies

# Simulation of Complicated Shapes

## P&EM News Note:

A new cut-cell generation algorithm has been developed and deployed in the 3D Direct Simulation Monte Carlo code SPARTA. The algorithm has been demonstrated with a variety of complex 2D shapes, such as the “sea urchin” geometry shown below. SPARTA now computes all the cut cell volumes, identifies any split cells, colors all grid cells as inside, outside, or cut/split. Each surface in a split cell is tagged by which split volume it belongs to, which will be needed for tracking particles into the split cells. Infinitely thin surfaces are detected and correctly dealt with during molecular advection.



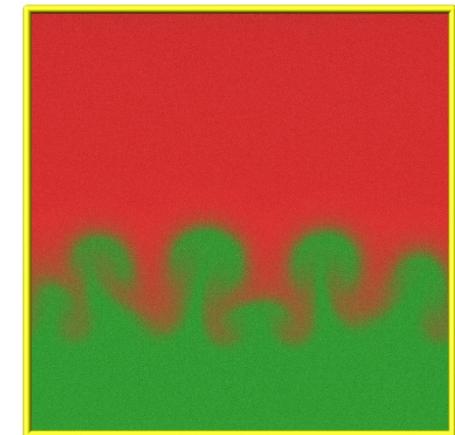
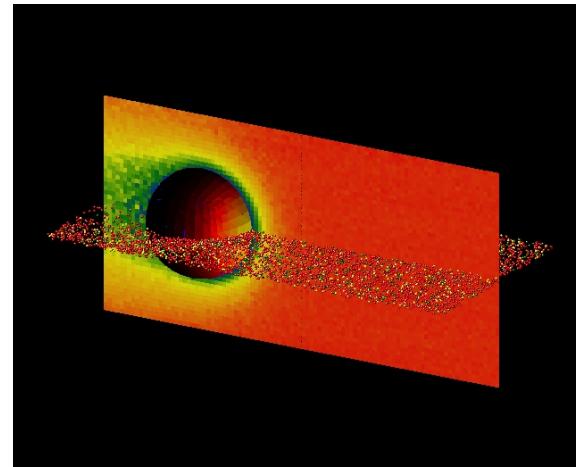
# In-Situ Visualization

Not a replacement for interactive viz, but ...  
Quite useful for **debugging** & quick analysis  
At end of simulation (or during), instant movie

Render a JPG snapshot every N time steps:

- Each processor starts with blank image (1024x1024)
- Processor draws its cells/surfaces/molecules with depth-per-pixel
- Merge pairs of images, keep the pixel in front, recurse
- Draw is parallel, merge is logarithmic (like MPI Allreduce)

Images are ray-traced quality



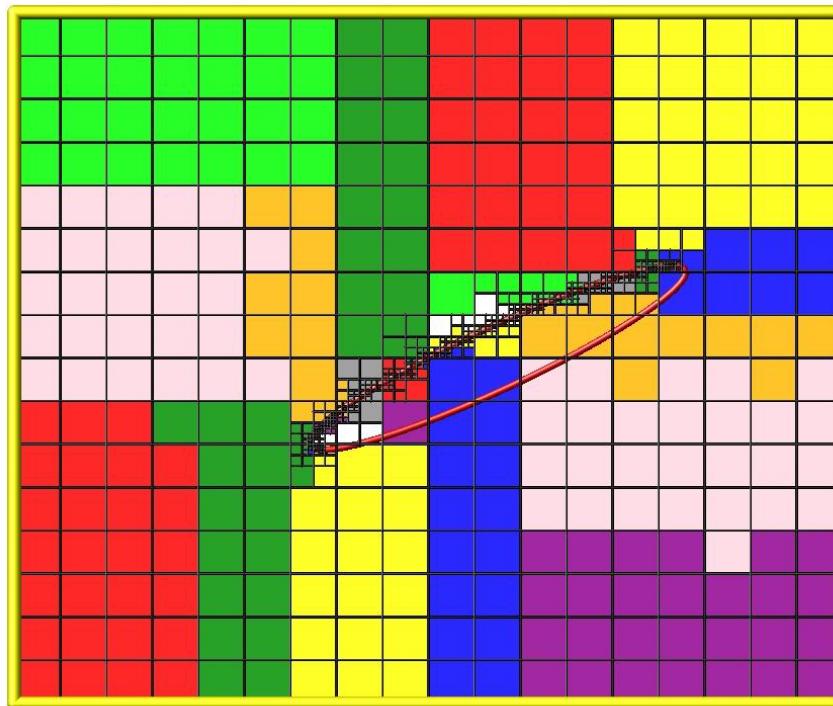
# Load Balancing

Balance across processors, **static or dynamic**

Granularity = grid cell with its molecules

Geometric method: recursive coordinate bisection (RCB)

**Weighted** by cell count or molecules or CPU



RCB is fast

Bigger cost is **data move**

Example:

1B cells on 1024 BG/Q nodes

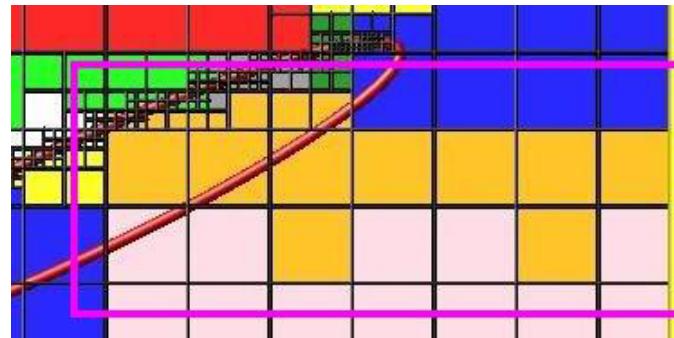
Worst case: move all cells

Balance time = 15 s:

(RCB=2, move=12, ghosts=1)

# Efficient Communication

- One processor = compact clump of cells via load balancing
  - Ghost region = nearby cells within **user-defined cutoff**
  - Store surface information for ghost cells to complete move



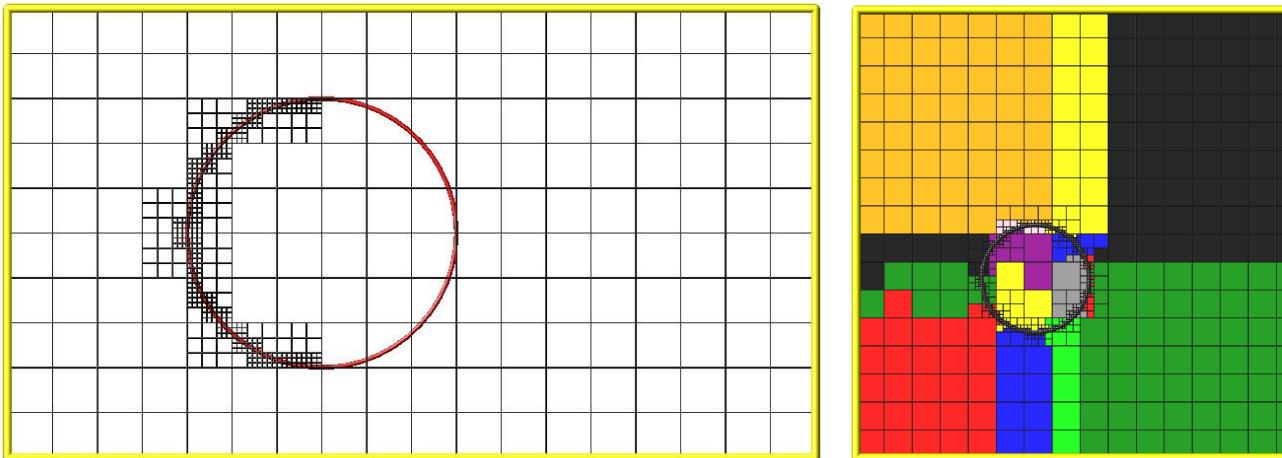
- Efficiently distributes grid information across processors
  - With sufficient cutoff, only **one communication per step**
  - Multiple passes if needed (or can bound molecule move)
- Communication with **modest count of neighbor processors**

# Work in progress



# Adaptive Gridding

- **Create/adapt grid in situ, rather than pre-process & read in**
- Examples: Generate around surface to user-specified resolution, adapt grid based on flow properties
- Algorithms should be efficient if they require only **local communications**

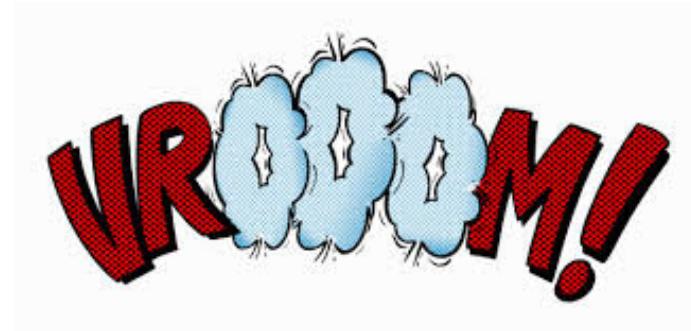
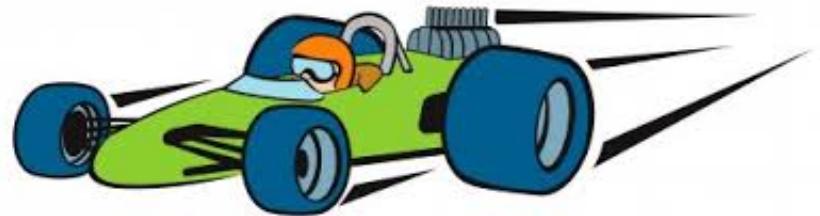


- Another setup task: label cells as outside/inside
- Simple if pre-processing, in situ easier for large problems

# Aiming for MPI+X via Kokkos

- What is Kokkos:
  - Programming model in development at Sandia
  - C++ template library
  - Open-source
  - Stand-alone
- Goal: write application kernels only once, and run them efficiently on a wide variety of hardware platforms
- Two major components:
  - Data access abstraction via Kokkos arrays optimal layout & access pattern for each device: GPU, Xeon Phi, etc.
  - Parallel dispatch of small chunks of work auto-mapped onto back-end languages: CUDA, OpenMP, etc.

# Parallel Performance



# SPARTA Benchmarking

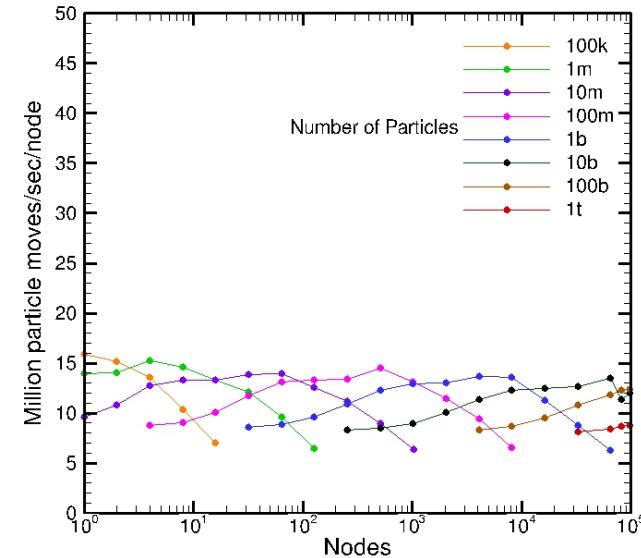
2 test cases:

- **Free-molecular**
  - Stress test for communication
  - 3D regular grid,  $10^4$ - $10^{11}$  (**0.1 trillion**) grid cells
  - 10 molecules/cell,  $10^5$ - $10^{12}$  (**1 trillion**) molecules
- **Collisional**
  - About 2x slower (sorting, collisions)
  - Same grid cell & molecule counts
- Effect of threading
  - **4 threads/core = 2x speed**

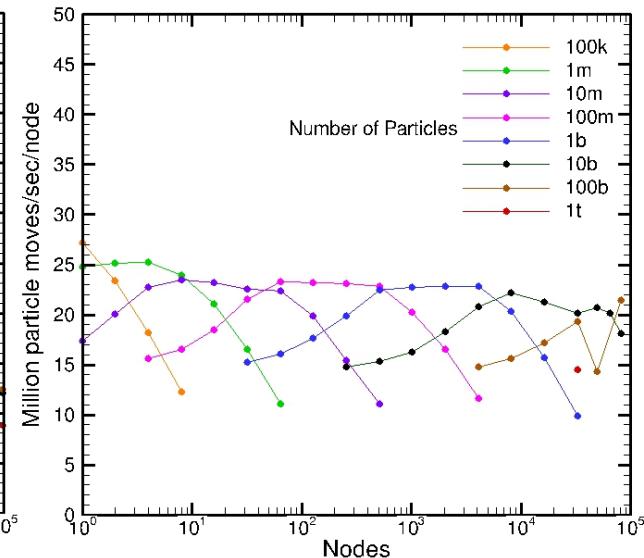


# SPARTA Benchmarking

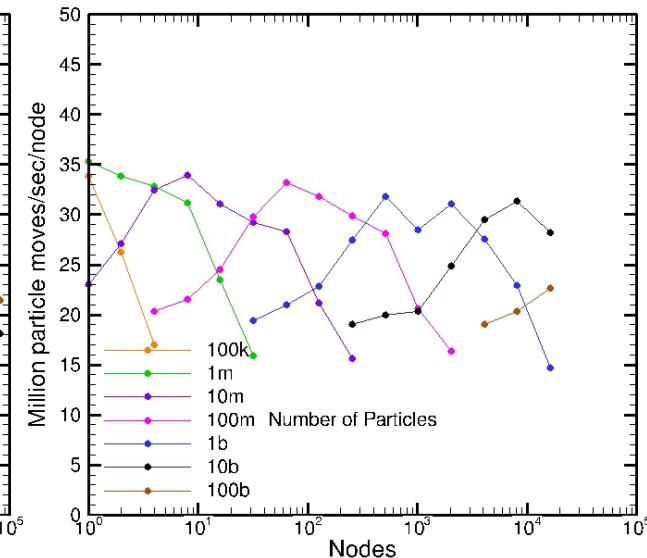
16 cores/node  
1 task/core



16 cores/node  
2 tasks/core



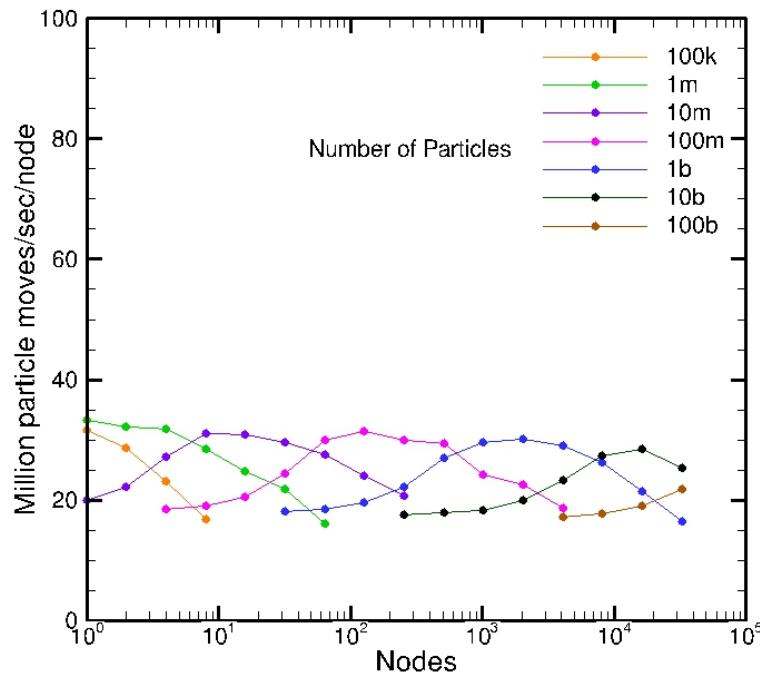
16 cores/node  
4 tasks/core



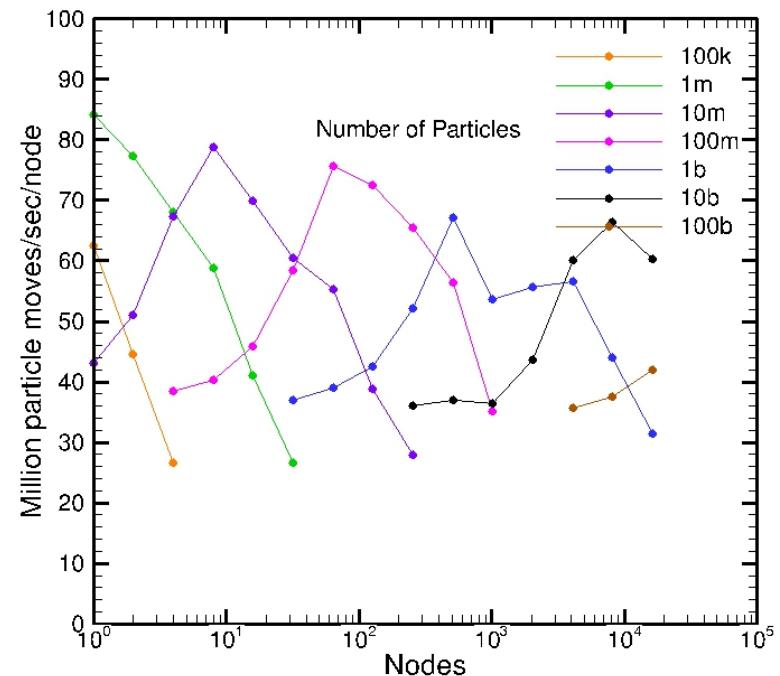
- Weak scaling indicates, 10% peak performance reduction from 1 to  $10^6$  cores
- 2 tasks/core gives 1.5x speedup, 4 tasks/core gives 2x speedup
- A total of **1 trillion molecules** can be simulated on **one third** of the BG/Q
- Maximum number of tasks is 2.6 million

# SPARTA Benchmarking (FM)

16 cores/node, 1 task/core



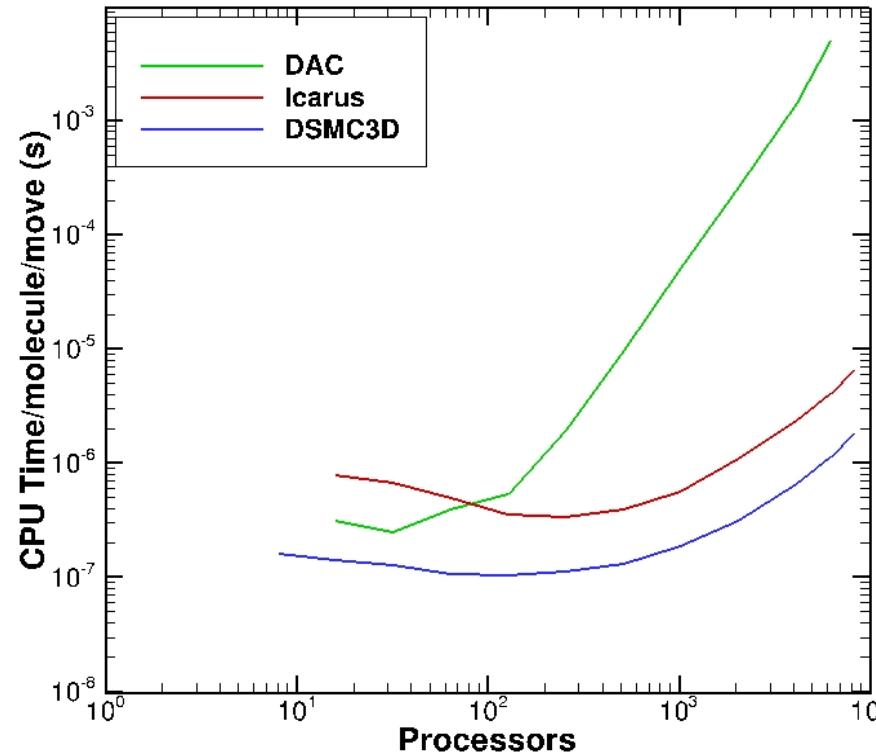
16 cores/node, **4** tasks/core



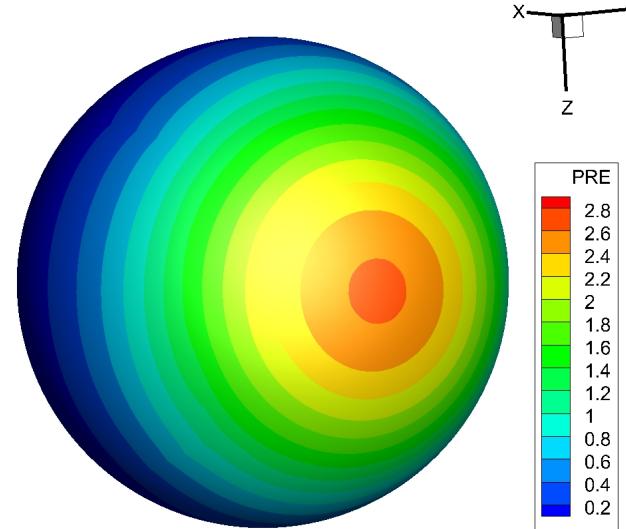
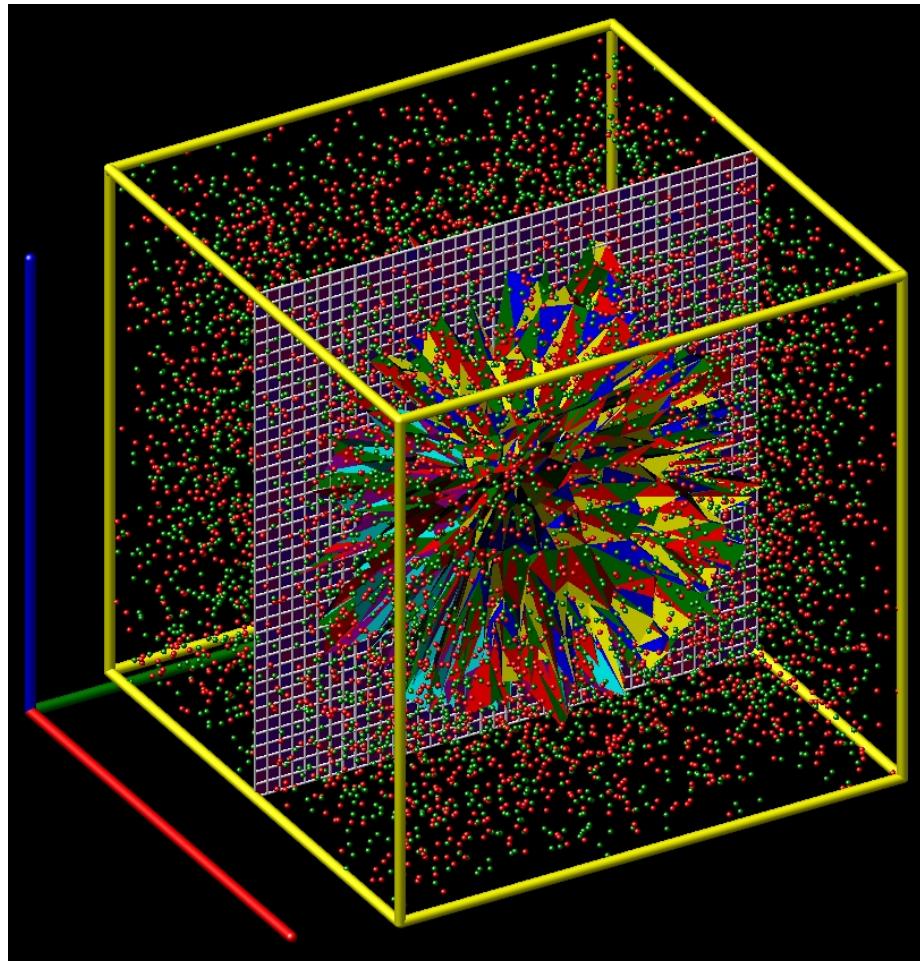
- Free-molecular (FM) calculations stress-test for communications
- 2x speedup compared to collisional

# Sparta vs Existing Codes

The scalability of the new code framework was compared to the most computationally efficient, existing parallel DSMC codes (3D NASA-DAC, 2D SNL-Icarus). Even for the most severe cases the new code's CPU cost is significantly lower, indicating a more efficient parallel implementation.



# Calculating forces on particles



# This is SPARTA



# DSMC vs. Boltzmann Equation

- Instead of solving Newton's laws of motion (Molecular Dynamics), DSMC replaces explicit intermolecular forces with stochastic collisions
- It has been shown that DSMC is **equivalent** to solving the Boltzmann equation (Nambu 1980, Babovsky 1989, Wagner 1992)
- DSMC has been shown to reproduce **exact** known solutions (Chapman-Enskog, Moment Hierarchy) of the Boltzmann equation (Gallis et al. 2004, 2006) for **non-equilibrium** flows
- In fact, DSMC is **superior** to solving the Boltzmann equation
  - DSMC can **model complicated processes** (e.g., polyatomic molecules, chemically reacting flows, ionized flows) for which **Boltzmann-type transport equations are not even known** (Struchtrup 2005)
  - DSMC **includes fluctuations**, which have been shown to be physically realistic (Garcia 1990) but which are **absent from the Boltzmann equation**

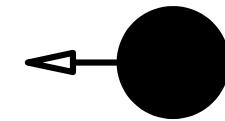
**The objective of DSMC is to simulate complicated gas flows using only collision mechanics of simulated molecules in the regime described by the Boltzmann equation**

# Thermophoretic force between two parallel plates

**Cold Wall**



**Hot Wall**



thermophoretic  
force

# Generation of thermophoresis

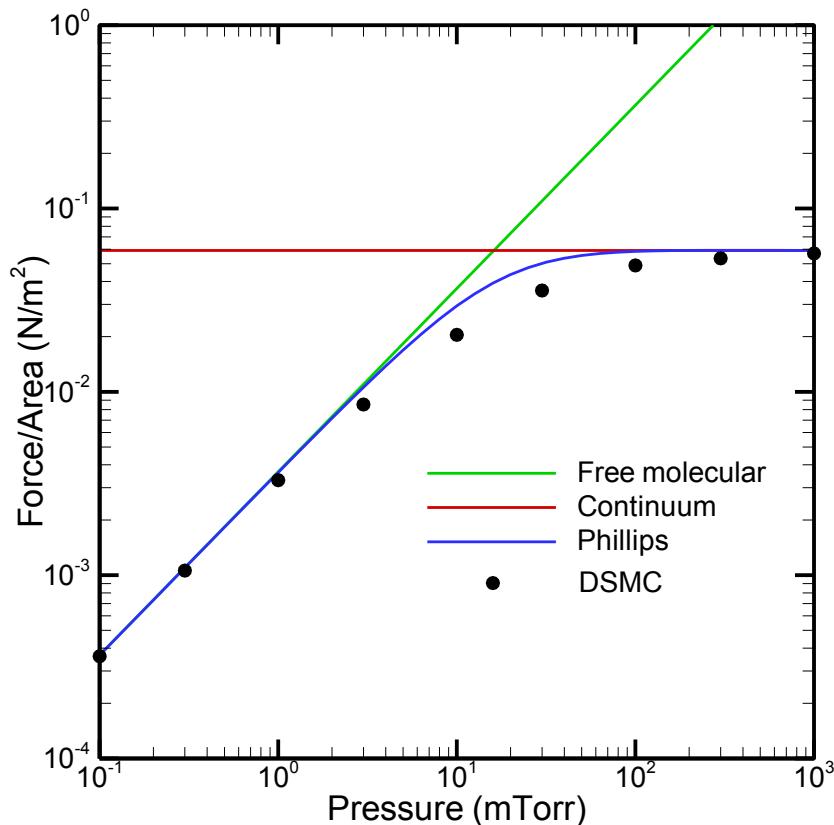
- Momentum transfer from gas molecules to macroscopic particle.
  - Larger on hot side.
  - Smaller on cold side.
  - **Not drag** - exists even without net mass flow.
- Heat flux also exists without net mass flow.
- Thermophoresis is associated with the heat flux.

# Test case conditions

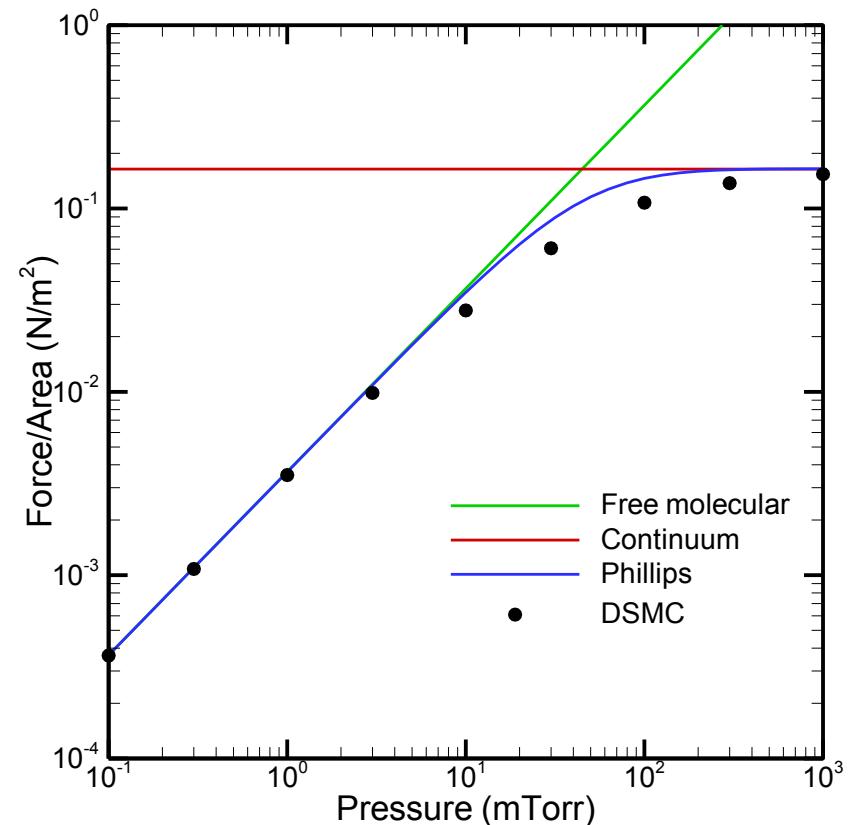
<b>Gas</b>	Argon, Helium
<b>Pressure</b>	0.1–1000 mTorr
<b>Temperature</b>	263–283 K
<b>Domain length</b>	0.01 m
<b>Grid</b>	100 x 10 (Low densities) 1000 x 10 (High densities)
<b>Time step</b>	$10^{-7}$ (Low densities) $10^{-8}$ (High densities)
<b>Molecules per cell</b>	100
<b>Molecular model</b>	VSS

# Thermophoretic force as a function of pressure

Argon



Helium



# Microscopic Dissociation Model

**When the vibrational level of a molecule exceeds the dissociation limit, dissociation occurs.**

**Maximum reachable vibrational state:**  $i_{\max} = \text{int}[E_c / (k\Theta_v)]$

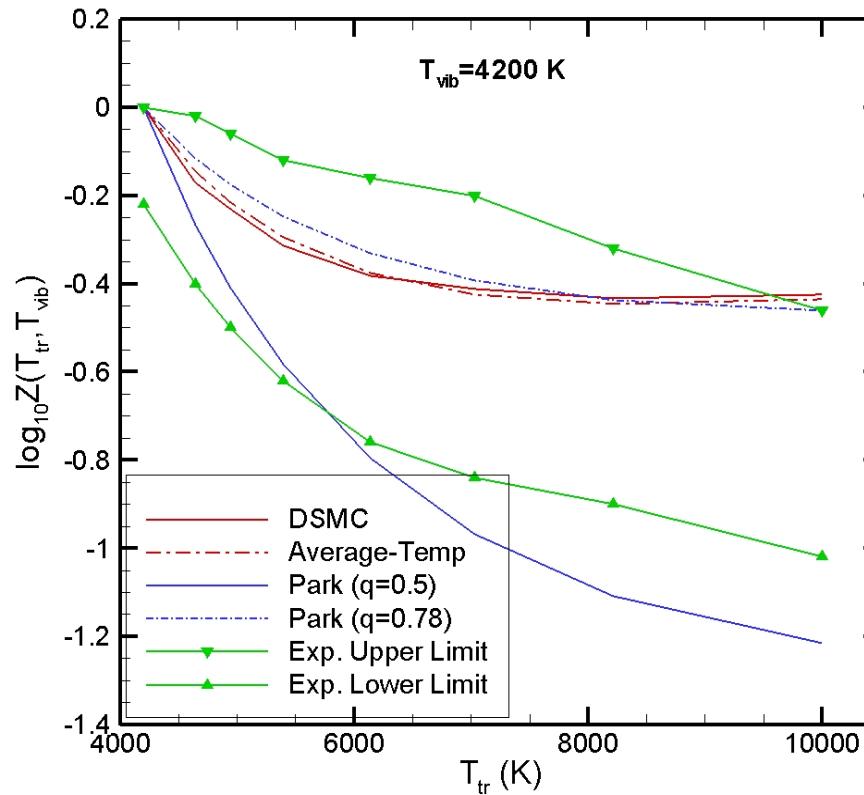
**where:**  $E_c = E_{\text{trans, pair}} + E_{\text{vib, mol}}$

**Dissociation occurs when:**  $i_{\max} > i_d$

**Dissociation rate coefficient:**

$$k(T_{tr}, T_{vib}) = \frac{2\sigma_{ref}}{\varepsilon\sqrt{\pi}} \left( \frac{T_{tr}}{T_{ref}} \right)^{1-\omega} \left( \frac{2k_B T_{ref}}{m_r} \right)^{1/2} \left\{ \sum_{i=0}^{i_d} Q \left[ \frac{5}{2} - \omega, \frac{\Theta_d - (i-1)\Theta_v}{T_{tr}} \right] \frac{\exp[-i\Theta_v/T_{vib}]}{z_{vib}(T_{vib})} + B \sum_{i=i_{d+1}}^{\infty} \frac{\exp[-i\Theta_v/T_{vib}]}{z_{vib}(T_{vib})} \right\}$$

# Comparison to Experimental Data



In the experiment (Sergievskaya et al.),  $T_{\text{vib}}$  was constant at 4200 K. DSMC is in agreement with measured non-equilibrium reaction rates. Park's model with  $q=0.78$  (for low T) is in good agreement with data.