



Sophisticated DSMC

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**DSMC: Fundamentals through Advanced Concepts
Short Course**

***Direct Simulation Monte Carlo: Theory, Methods, and Applications
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Outline

- Characteristics
- Implementation
- Convergence
- Efficiency
- Accuracy



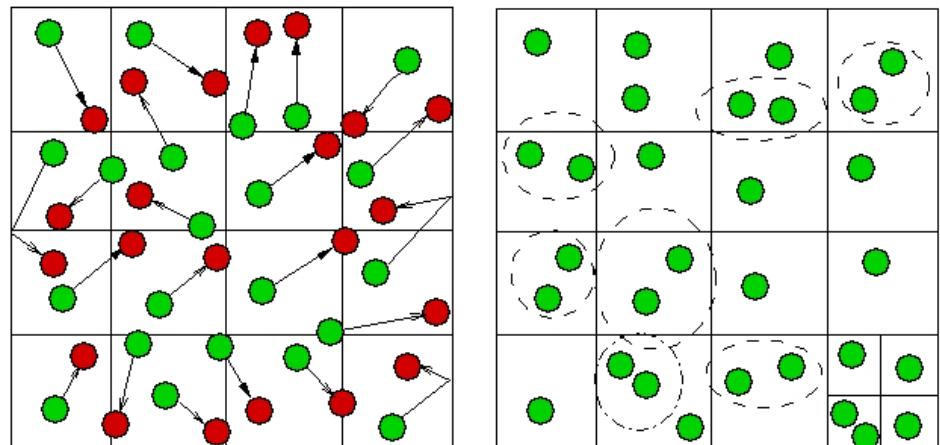
DSMC Procedures

- Since the inception of the original DSMC algorithm (1963), there have been no major changes to it.
- DSMC has been shown to provide solutions to the Boltzmann equation more accurately than any other numerical method.
- The original 1994 DSMC algorithm (DSMC94) has been criticized as being computationally inefficient.
- Bird's new DSMC algorithm (DSMC07) addresses these concerns while maintaining the accuracy of the method.



Overview of Sophisticated DSMC

- Basic features of DSMC algorithm retained
 - Move (ballistic at molecular velocity)
 - Collisions (binary, molecular chaos)
 - Molecular models (VSS, VHS)
 - Collision frequency calculation
 - Sampling
- Changes in collide
 - Nearest neighbor collisions
 - Virtual collision cells (VCS): nearest-neighbor (NN) collisions, N^2 operation ($N < 30$)
 - Adaptive transient collision cells (TASC) based on a background grid ($N > 30$)
 - Exclusion of latest collision partner: physically realistic requirement for NN schemes
- Changes in temporal advection
 - Two time-steps used
 - Global time step
 - Cell-based time step
- Changes in time-tracking
 - Global time
 - Cell time
 - Molecule time
- Separate sampling and collision cells





DSMC94 Collision Partner Selection

- DSMC94 **randomly selects collision partners from a cell**
- Average distance between two randomly selected points in an n-D cell:
 - 1-D = 0.333...
 - 2-D = 0.521...
 - 3-D = 0.662...
- Independent of number of points per cell.
- Increasing the number of simulators per cell (N_c) will not reduce mean distance between randomly selected molecules.



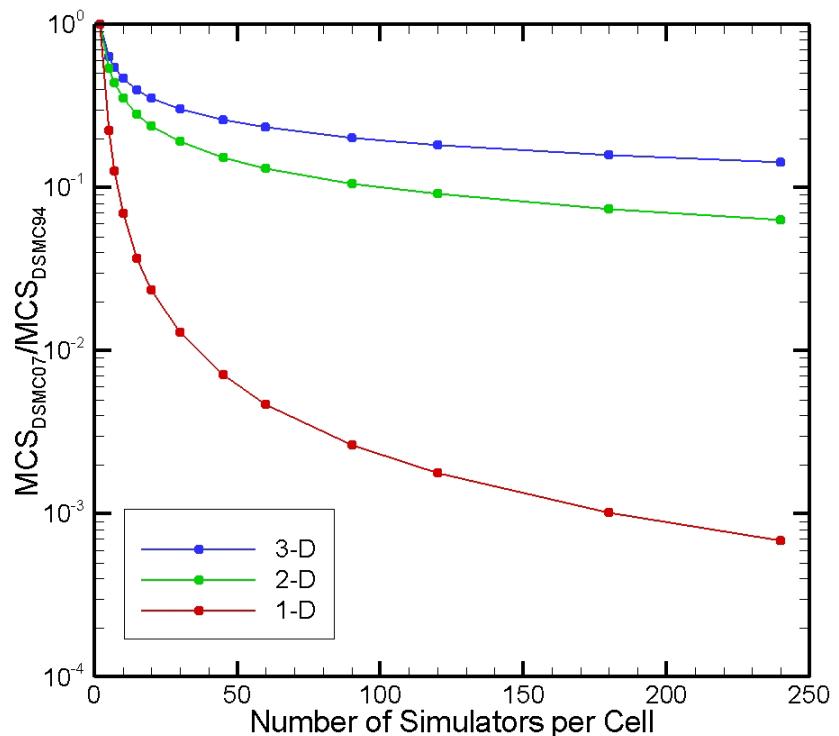
VSC and TASC

- Virtual Sub Cells (LeBeau 2003)
 - Deterministically determines the nearest neighbor
 - More accurate
 - More expensive than TASC for large N, $O(N^2)$
- Transient Adaptive Sub Cells (Bird 2000)
 - Stochastically determines the nearest neighbor
 - Creates Cartesian sub-cell structure for each collision phase
 - Number simulators in each sub-cell ~ 1-2
 - Less expensive for large N, $O(N)$



VSC, TASC Spatial Discretization

- With VSC, TASC the average distance between nearest-neighbor points in a cell is a function of:
 - Dimensionality
 - Cell Size
 - Number of Simulators
- Effect plateaus after about
 - 50 sims/cell for 3-D
 - 100 sims/cell for 2-D
 - 250 sims/cell for 1-D





VSC, TASC Result in Better Spatial Discretization

- The way potential collision partners are selected affects the average distance between collision partners.
- The spatial discretization error is a function of the **MCS/MFP** ratio.
 - “MCS” is Mean Collision Separation, “MFP” is Mean Free Path

Effect on Mean Collision Separation (MCS)		
	DSMC94	DSMC07
Simulators/cell	no	yes
Cell Size	yes	yes
Dimensionality	yes	yes

DSMC94 achieves only cell-size resolution

- Collisions between random simulators

DSMC07 achieves sub-cell resolution

- Collisions between nearest neighbors



Nearest Neighbor Procedures

- This improvement comes at a cost.
- VSC and TASC are computationally more expensive than random selection.
- However, MCS will be smaller and the accuracy better.
- Same pair cannot have sequential collisions.
 - Physically unlikely collision.
- Coarse, reduced-dimensionality implementations can introduce stress-tensor anisotropy.
 - Molecular motion is always 3-D even in 1-D codes.
 - Periodic boundary conditions on degenerate dimensions.



Temporal Discretization

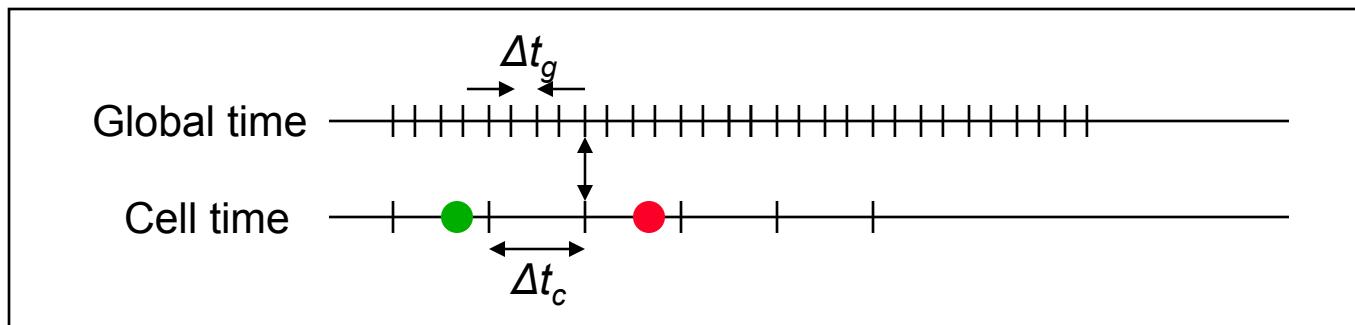
DSMC07 Time-Step Properties

- **Local**: Cell-based time step (Δt_c): function of the local collision frequency and average molecular speed
- **Adaptive**: Global time step (Δt_g): function of the average Δt_c (adjusted during run)
- **Dynamic**: Move and collision phases are not synchronized for the whole domain (large low-collisionality regions)
- **Collisions** are considered for a collision cell
Move is considered for a particular molecule



DSMC07 Advection and Collision

- Global time advances with small global time steps (Δt_g)
Uniform throughout the domain, similar to DSMC94 time step
- Cell time step (Δt_c) is local (cell-based) and is a fraction of the local mean collision time (MCT) and the mean cell transit time (MTT)
- *With this (cell-based) time step:*
 - Cells perform collisions for $2\Delta t_c$ only when their “time” (cell time) falls more than Δt_c behind global time
 - Molecules move $2\Delta t_c$ only when their “time” (molecule time) falls more than Δt_c behind global time





Calculation of Δt_c

- Cell time step (Δt_c) is local (cell-based) and is a fraction of the local mean collision time (MCT) and the mean cell transit time (MTT)
- Cells are examined at frequent intervals to calculate new values for the time step.
- MTT is based on both thermal and average molecular velocities.
 - Typical values: $MCT=3\sim5$, $MTT=2\sim4$



Calculation of Δt_g

- The global time step is calculated as a function of (Δt_c)
- When all cells have updated their (Δt_c), the minimum, average, and maximum (Δt_c) are calculated.
- Δt_g is a user-specified function of the average Δt_c
 - *Typical value* $\Delta t_g = 0.2 \Delta t_{c,average}$
- Smaller values of Δt_g lead to more accurate simulations.

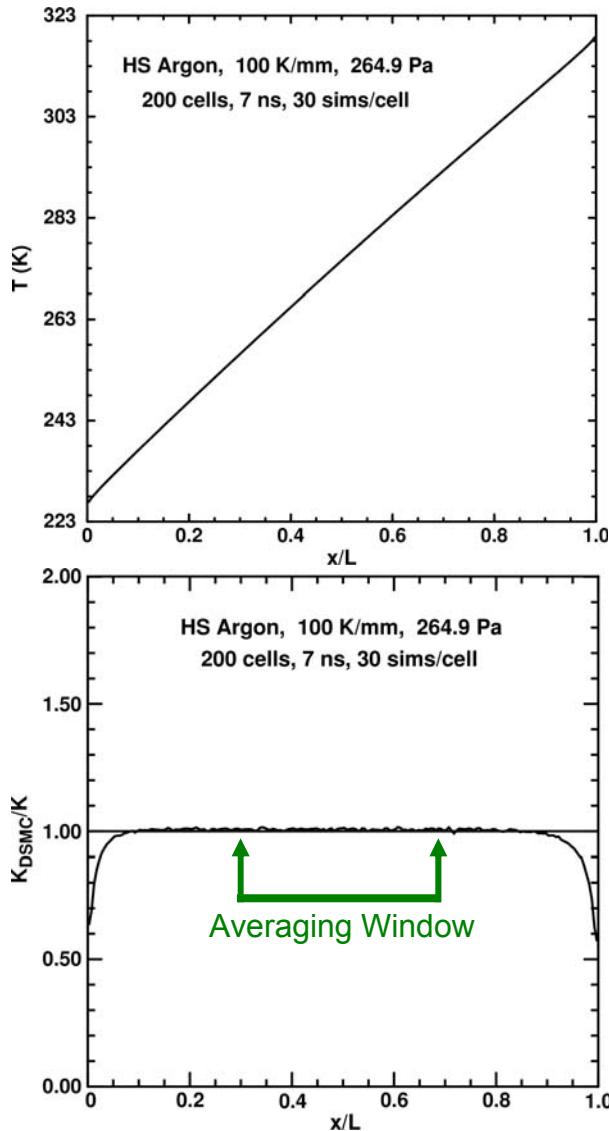


Move-Collide: A Closer Coupling

- Molecules cannot travel across a sampling cell in one move without considering collisions.
- DSMC07 is more sensitive to time step.
- It is physically inconsistent to allow molecules to ignore collision partners during long advection phases.
- Similar to DSMC94 sub-cells. Time step should conform to sub-cell structure.



Assessing DSMC Convergence



Temperature Profile

- Nearly linear
- Near-continuum
- Small jumps near walls

Thermal conductivity from
CE theory and **DSMC94 results**

$$q = K_{DSMC} \left(\frac{\partial T}{\partial x} \right)$$

Average over central 40% of domain to
obtain a single convergence metric

$$K_{DSMC} / K$$



Sophisticated DSMC (DSMC07) Convergence Behavior

- The algorithm was implemented in a 1-D DSMC code
- To allow for a “fair” comparison:
 - Time step was based on mean collision time only
 - Identical collision and sampling cells
 - Virtual sub-cells were used for any N_c
- To eliminate statistical noise, 100 simulations were performed for each data point (ensemble averaging)



Numerical Error in DSMC Procedures

Four parameters control DSMC numerical error

- Sample size per cell (M_c)
- Simulators per cell (N_c)
- Cell size (Δx)
- Time step (Δt)

} → statistical error
} → discretization error

Error related to cell width, Δx

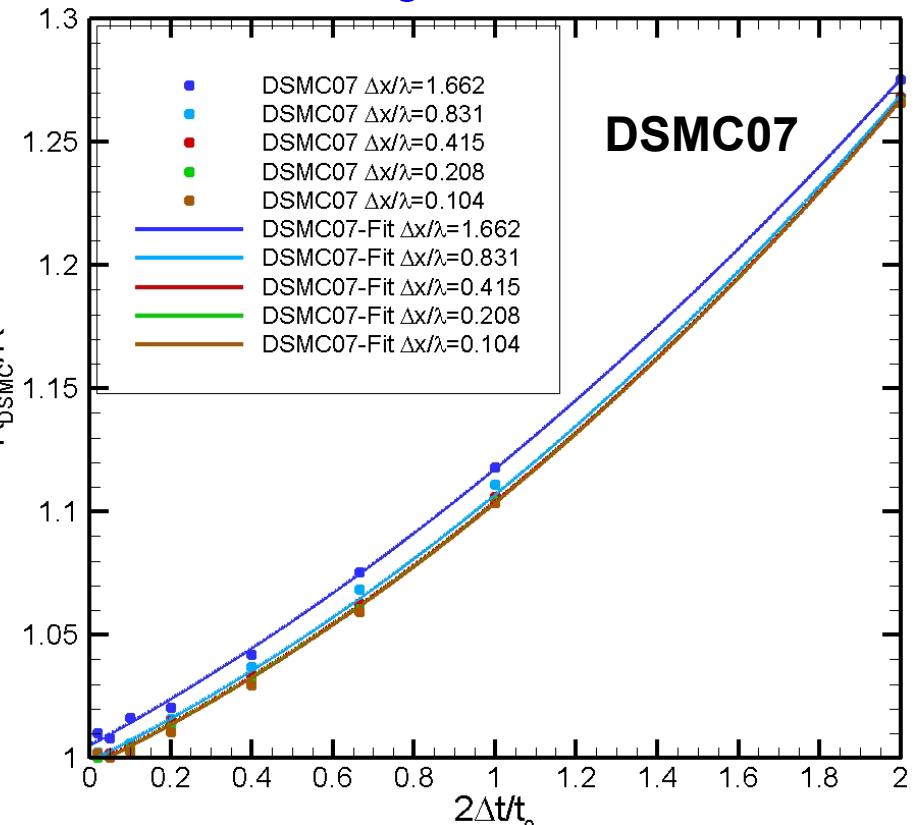
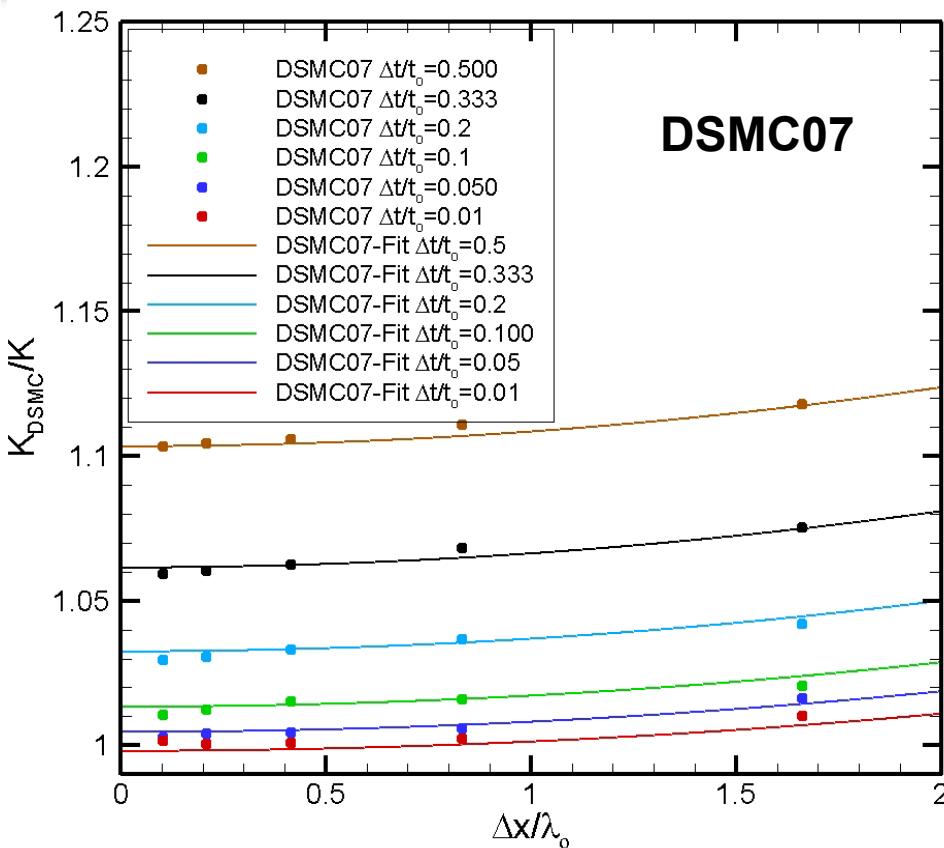
- Collision partners selected from anywhere in same cell
- Some potential partners move into adjacent cells
- Some invalid partners move into the same cell

Error related to time step, Δt

- Collisions occur at the end of time step
- Collisions should be uniformly distributed over time step



Convergence Behavior for $N_c \rightarrow \infty$

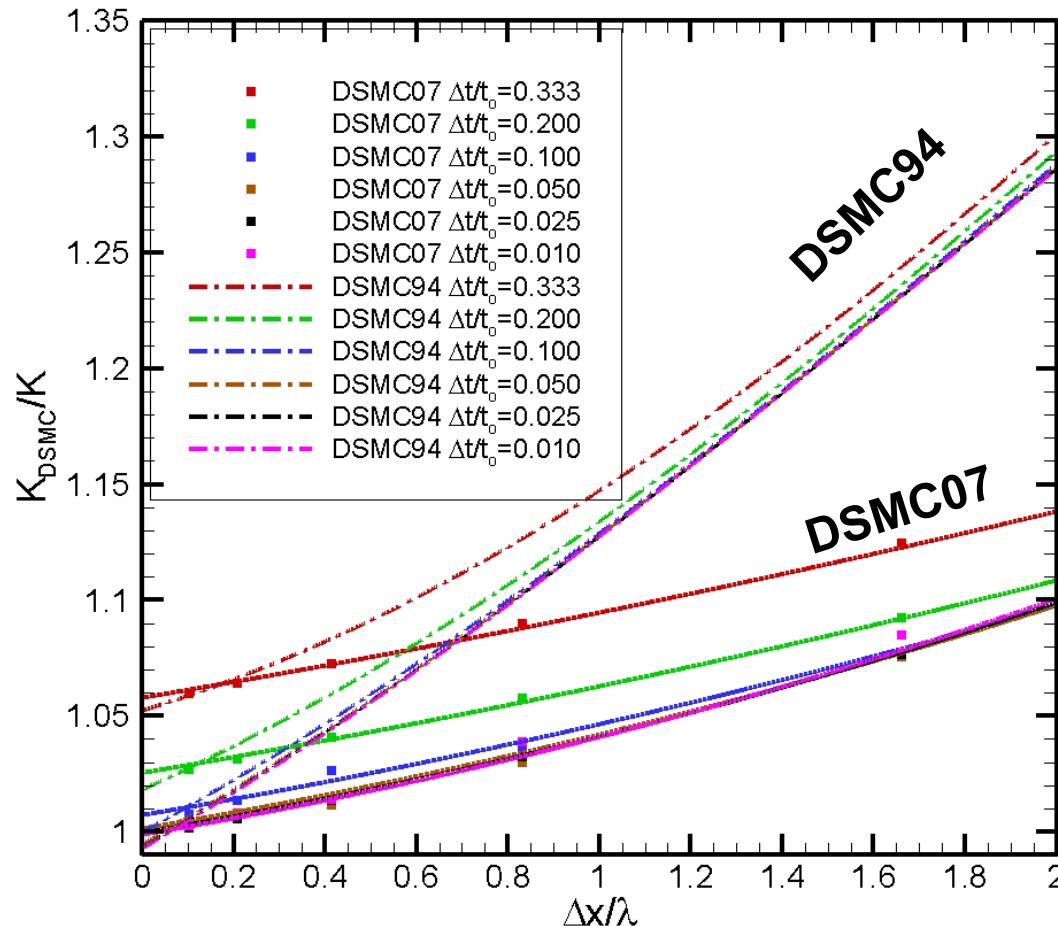


- The algorithm is
 - **Insensitive** to spatial resolution
 - Spatial resolution constraint: $\Delta x \leq \lambda$
 - **Almost linearly** dependent on time step



Convergence Behavior for $N_c = 10$

Effect of Cell Size

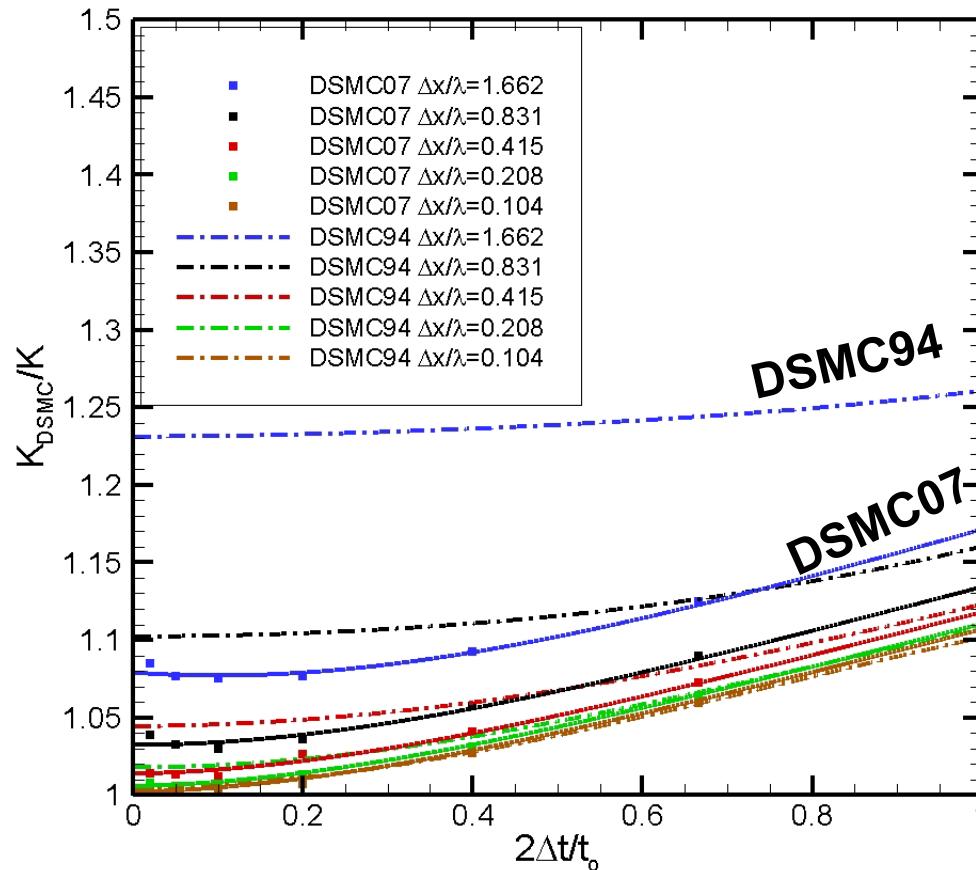


- For finite number of simulators, the algorithm is
 - **Insensitive** to spatial resolution
 - With **error below 2%** for all cases as long as $\Delta t/t_o \leq 0.2$



Convergence Behavior for $N_c = 10$

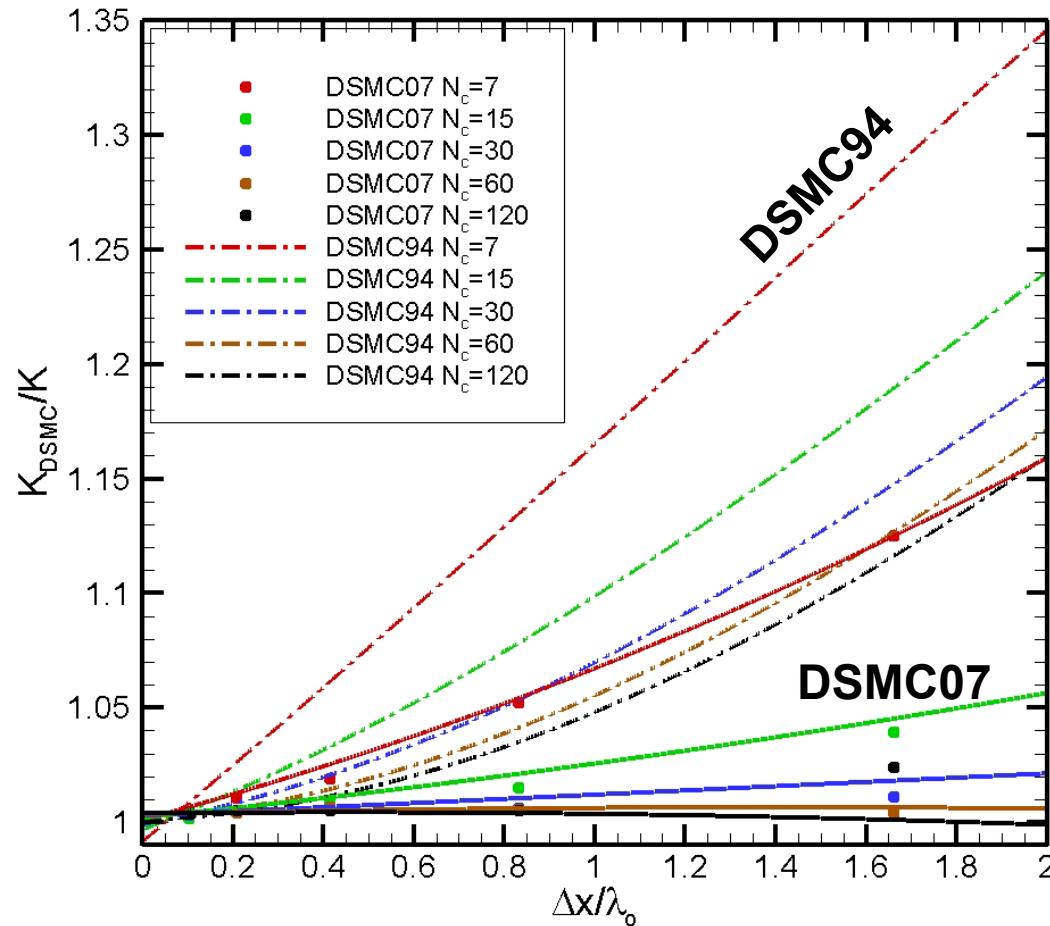
Effect of Time Step



- The algorithm exhibits a **near-linear dependence** on time step
- For nearest-neighbor schemes, time-step should conform to effective spatial resolution.



Effect of Simulators Per Cell N_c at $\Delta t/t_o = 10$

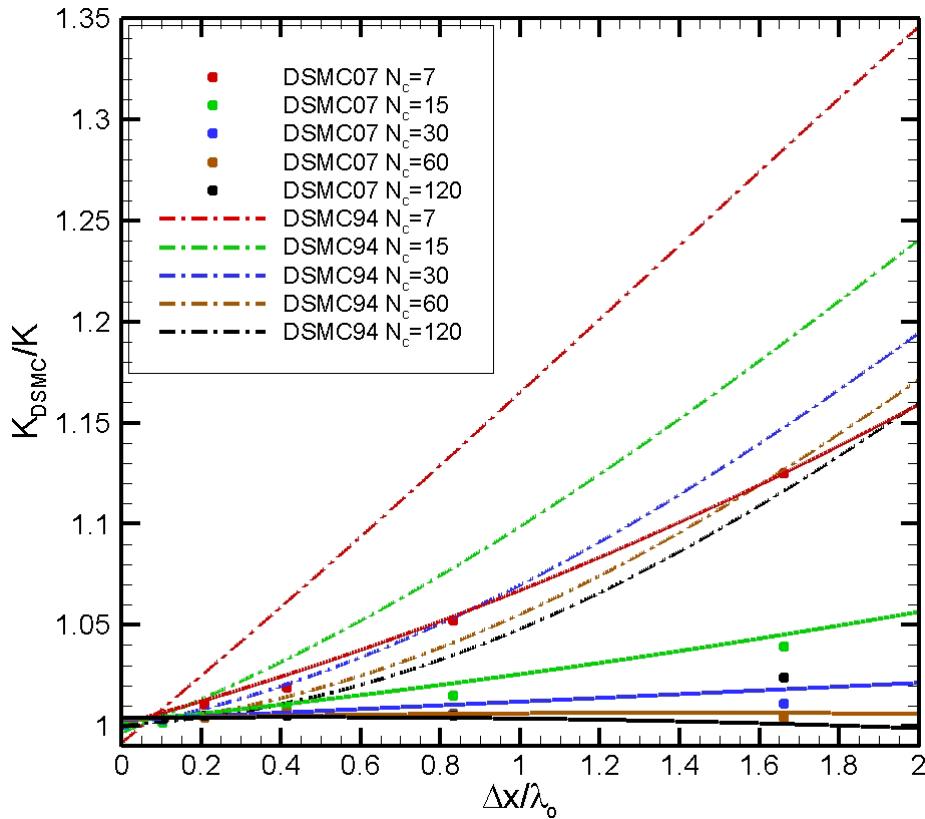


- By following DS2V guidelines error can be limited to ~2%

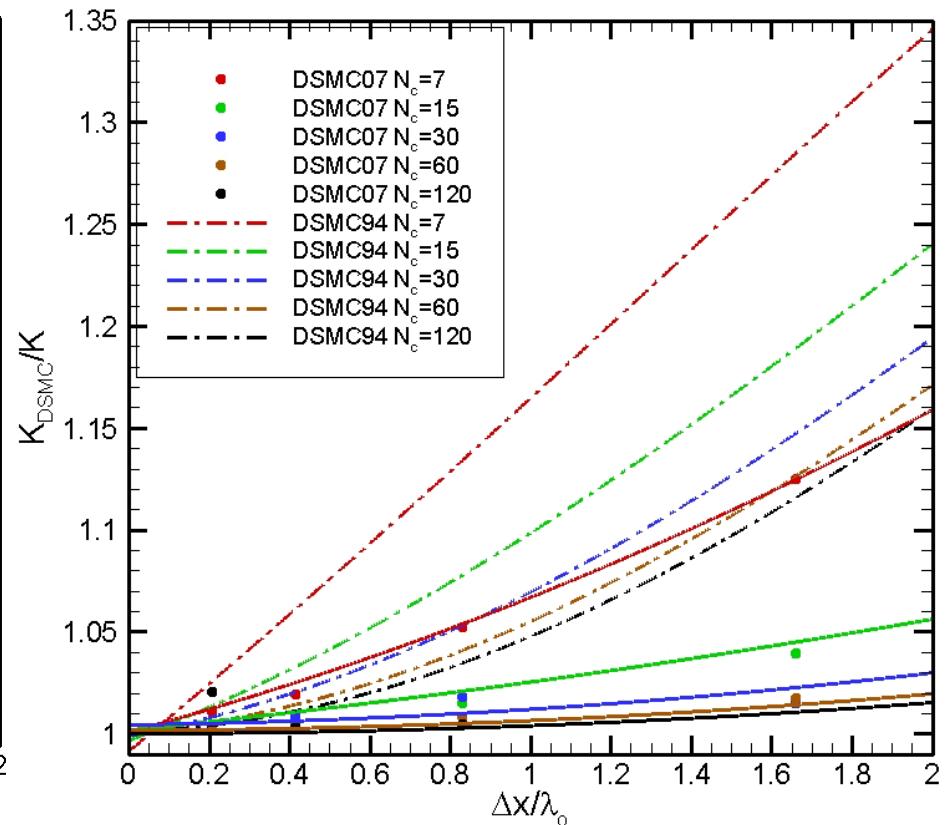


Effect Search Scheme ($\Delta t/t_o = 10$)

VSC



TASC

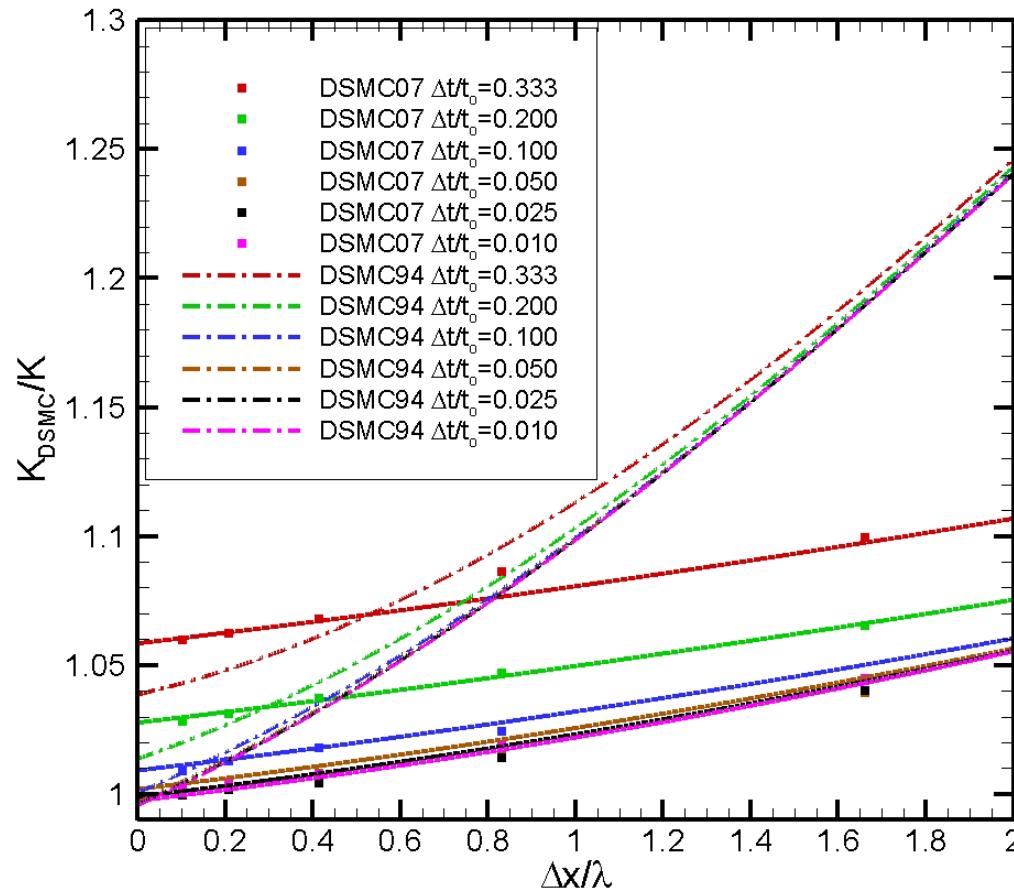


- VSC and TASC give similar results for small N_c .
- For large N_c TASC may not always pick the nearest neighbor.



Convergence Behavior for $N_c = 15$

Effect of Time Step

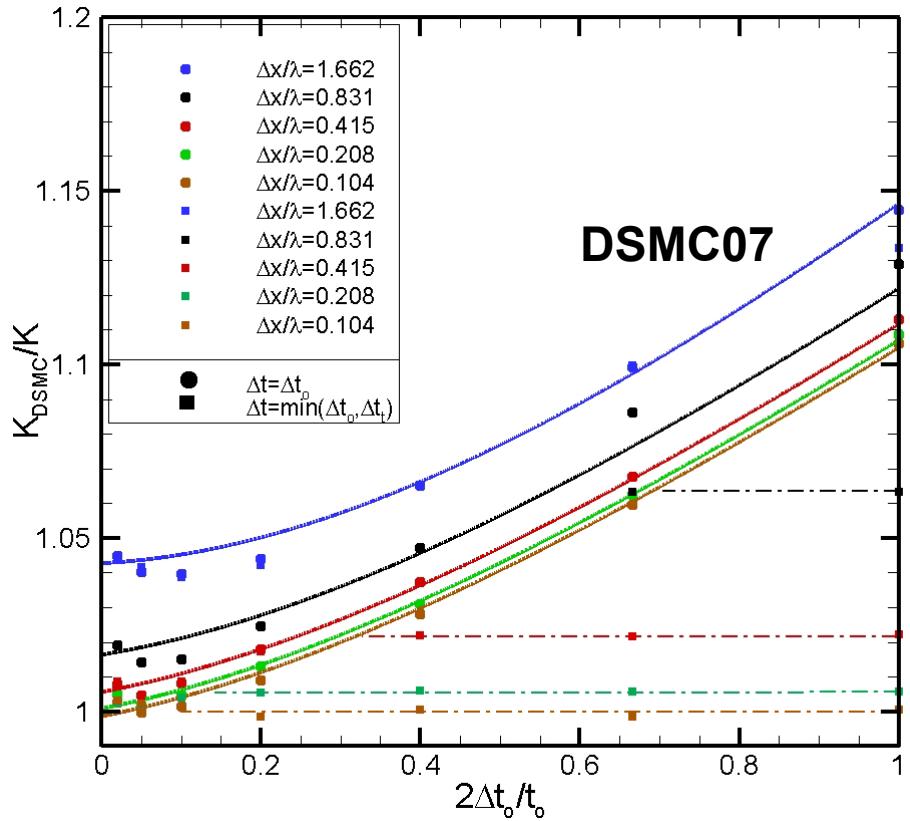
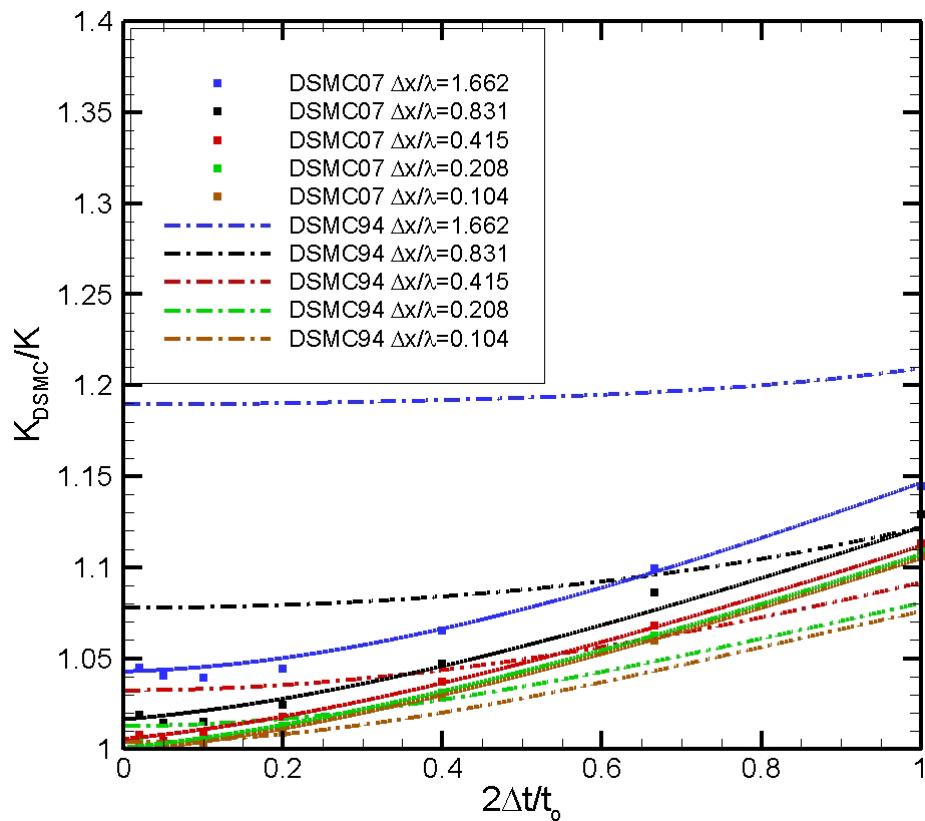


For large $\Delta t/t_0$ and fine $\Delta x/\lambda$, the error of DSMC07 can be greater than DSMC94!



Convergence Behavior for $N_c = 15$

Limiting the Time Step error



The DSMC07 time step Δt is based on both

- mean collision time t_o , via $\Delta t_o \propto t_o$
- mean cell-transit time t_t , via $\Delta t_t \propto t_t$



DSMC94

Functional Form of Error

Best-fit correlation function for DSMC94

$$\frac{K_{DSMC}}{K} = 1.0001 + 0.0286 \left(\frac{\Delta t}{t_o} \right)^2 + 0.0411 \left(\frac{\Delta x}{\lambda} \right)^2 - 0.01 \left(\frac{\Delta t}{t_o} \right)^2 \left(\frac{\Delta x}{\lambda} \right)^2 - 0.147 \frac{1}{N_c} + \frac{1}{N_c} F \left[\frac{\Delta t}{t_o}, \frac{\Delta x}{\lambda}, \left(\frac{\Delta t}{t_o} \right)^2 \right]$$

DSMC94 limiting convergence behavior is in agreement with GK theory

- Quadratic convergence in time step ($\Delta x/\lambda \rightarrow 0$, $N_c \rightarrow \infty$)
- Quadratic convergence in cell size ($\Delta t/t_o \rightarrow 0$, $N_c \rightarrow \infty$)
- Linear convergence in $1/N_c$ for $N_c \geq 30$ simulators/cell
- *Coefficients* in good agreement with GK theory
- Cross terms needed for finite discretization



DSMC07

Functional Form of Error

Best-fit correlation function for sophisticated DSMC with $\Delta t = \Delta t_o$

$$\frac{K_{DSMC}}{K} = 0.99508 + 0.06289 \left(\frac{2 \cdot \Delta t}{t_o} \right) + 0.04780 \left(\frac{2 \cdot \Delta t}{t_o} \right)^2 - 0.00267 \left(\frac{\Delta x}{\lambda} \right)^2 \\ - 0.00193 \left(\frac{2 \cdot \Delta t}{t_o} \right)^2 \left(\frac{\Delta x}{\lambda} \right)^2 + 0.09216 \frac{1}{N_c} + \frac{1}{N_c} F \left[\frac{2 \cdot \Delta t}{t_o}, \frac{\Delta x}{\lambda}, \left(\frac{2 \cdot \Delta t}{t_o} \right)^2 \right]$$

DSMC limiting convergence differs from Green-Kubo (GK) behavior

- Linear convergence in time step ($\Delta x/\lambda \rightarrow 0, N_c \rightarrow \infty$)
- Weak quadratic convergence in cell size ($\Delta t/t_o \rightarrow 0, N_c \rightarrow \infty$)
- Linear convergence in $1/N_c$ for $N_c \geq 30$ simulators/cell
- Cross terms needed for finite discretization (but in general smaller than for DSMC94)

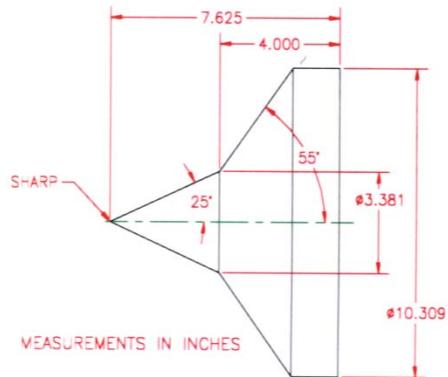


Assessing Efficiency

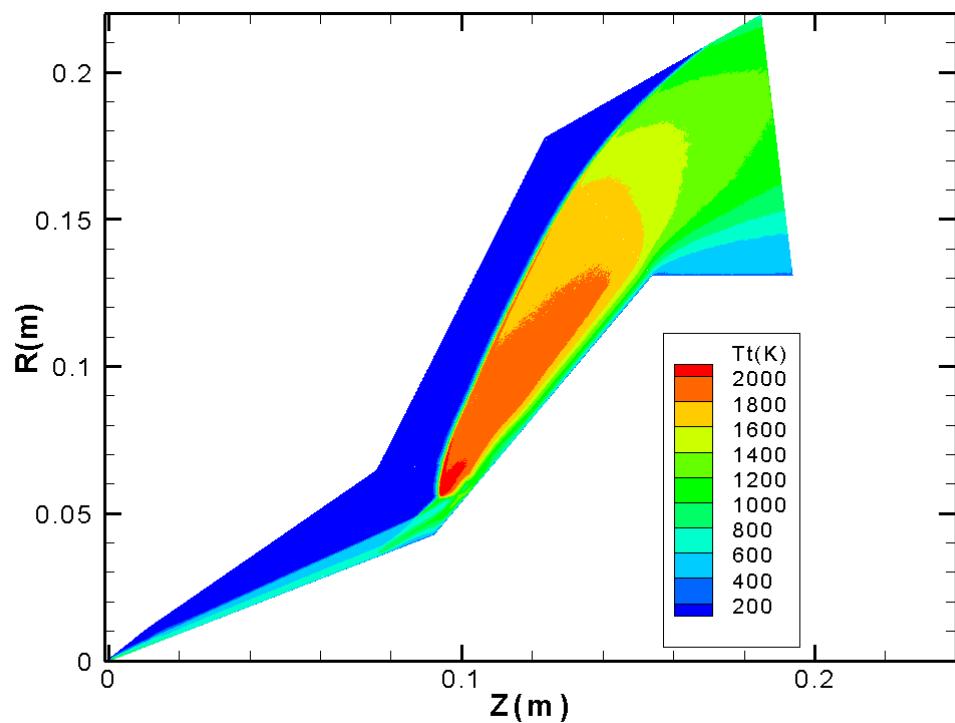
- Is the new method computationally more efficient than the old one?
- “Efficiency” is essentially the amount of time that can be simulated with a prescribed accuracy on the same computational platform.



Hypersonics Simulation



Mach 11, 25° - 55° blunt biconic

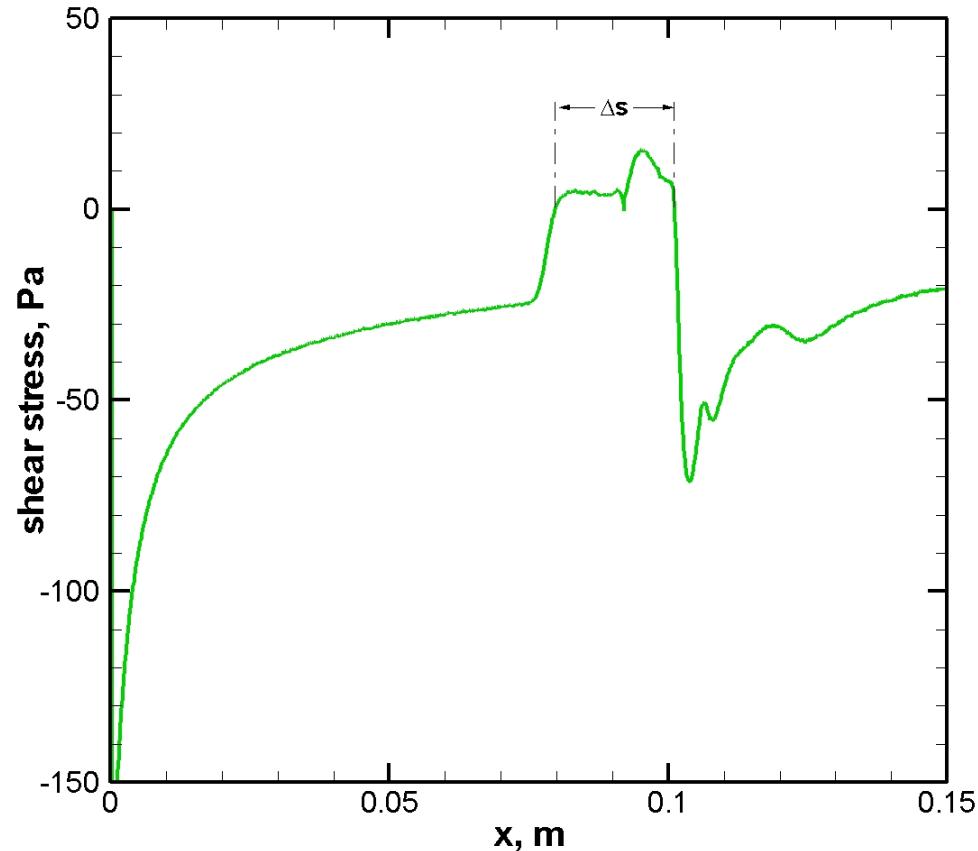


Flow Conditions

- Nitrogen gas
- $Re = 140,000/m$
- $T_0 = 3280$ K
- $V = 2072$ m/s
- $Kn = 0.02$
- $M = 11.3$
- $T = 42$ K
- $T_{vib} = 1983$ K



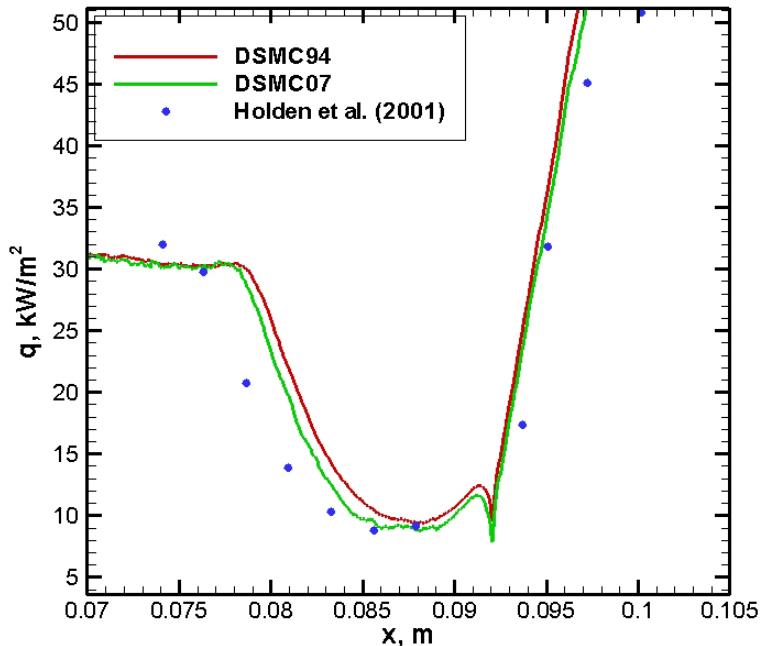
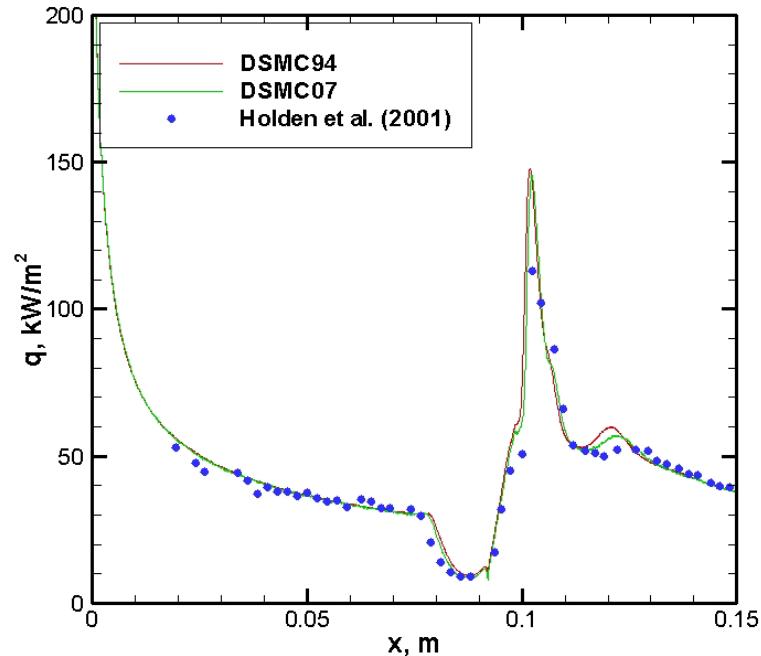
Recirculation Zone



Extensive studies, (Moss, Markelov) indicate that the extend of the recirculation zone is $\Delta_{s,o}=21.5\text{mm}$.
 Δs is sensitive to discretization parameters and is used as a convergence criterion.



DSMC94 & DSMC07 Simulation Speed when Achieving Equal Accuracy

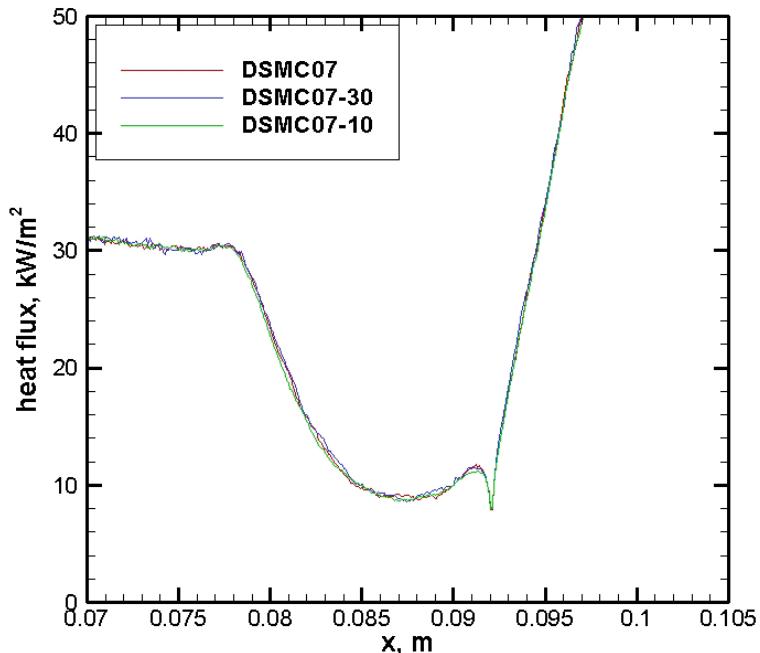
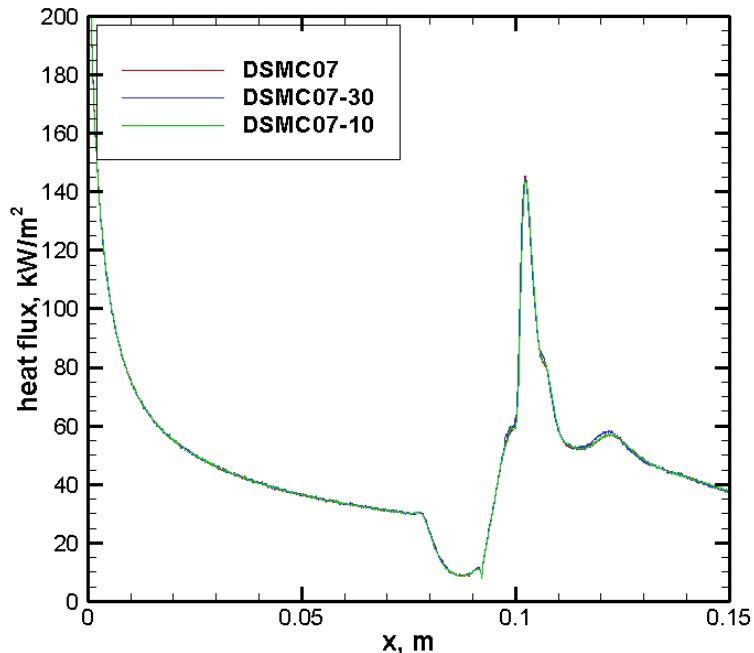


DSMC94 MCS = DSMC07 MCS

DSMC94				DSMC07			
# Cells	Sims/cell	$\Delta s/\Delta_{s,0}$	ns/proc-min	# Cells	Sims/cell	$\Delta s/\Delta_{s,0}$	ns/proc-min
250,000	10	76%	8.72	250,000	10	94%	5.61
1,000,000	10	94%	1.48	1,000,000	10	100%	1.01



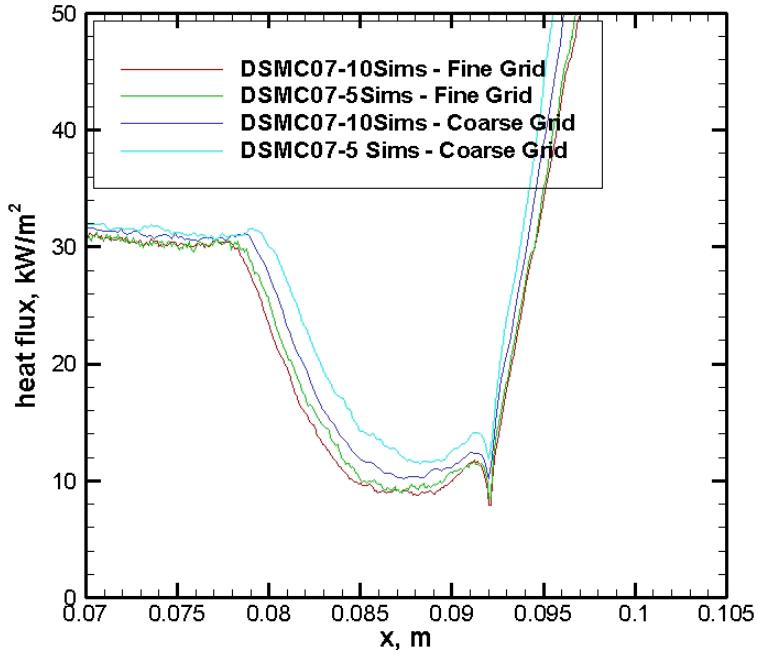
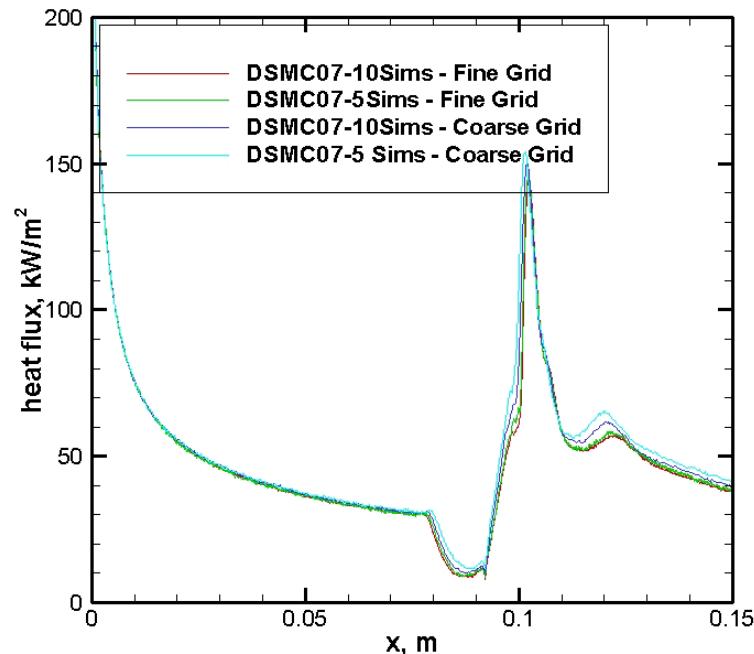
DSMC07 Simulation Speed Limited Collision Partner Search



Algorithm	$\Delta s / \Delta s_{s,o}$	ns/proc-min
DSMC07	99.5%	1.01
DSMC07-30	100%	1.19
DSMC07-10	99.0%	1.33
DSMC94	94.4%	1.48



DSMC07 Simulation Speed Simulators or Cells?



Algorithm	$\Delta s / \Delta_{s,o}$	ns/proc-min
10 Sims & Fine Grid	99.5%	1.01
5 Sims & Fine Grid	97.2%	1.16
10 Sims & Coarse Grid	94.4%	5.61
5 Sims & Coarse Grid	86.5%	9.51



DSMC Guidelines

DSMC94 rule-of-thumb guidelines

- Sample enough to drive statistical error down
- Keep time step smaller than $\sim 1/4$ mean collision time
- Keep cell size smaller than $\sim 1/3$ mean free path
- Use a minimum of ~ 20 simulators per cell

DSMC07 rule-of-thumb guidelines

- Sample enough to drive statistical error down
- Keep time step smaller than $\sim 1/3$ mean collision time and $\sim 1/2$ mean cell transit time
- Keep cell size $\sim 1/2$ mean free path
- Use ~ 10 simulators per cell

Following these simple guidelines will lead to a discretization error $\sim 2\%$



Summary

- DSMC07 can achieve the same accuracy as DSMC94 using less resources.
- VSC/TASC is the main contributor.
- Dynamic time-stepping offers significant advantages.
- For nearest-neighbor schemes, time-step should conform to effective spatial resolution.



Assessing the Accuracy of DSMC

- Comparison of DSMC predictions to measured flow field quantities is the ultimate criterion
- Simple, 0-D or 1-D problems can be very efficient in assessing the accuracy of the DSMC algorithm (or its implementation)
- Analytical solutions exists for flows in:
 - Equilibrium
 - Local thermodynamic equilibrium
 - Near-equilibrium (Chapman-Enskog regime, $Kn \sim 0.01$)
 - Thermodynamic non-equilibrium ($Kn > 0.01$)



Collision Frequency in an Equilibrium Bath

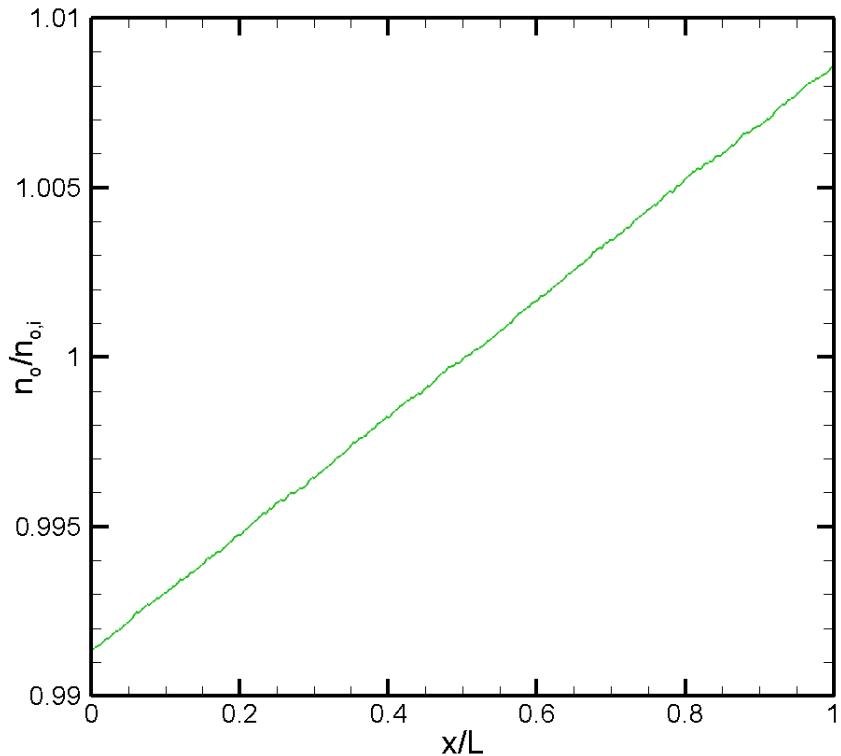
Simulators per cell	ν_{DSMC07} / ν_{th}
2	0.9969
5	1.0004
10	0.9994
30	1.0007
60	0.9970
120	1.0001

- Molecules HS “argon”
- Walls fully accommodating
- Width 0.001 m (1 mm)
- Pressure 264.9 Pa (~2 torr)

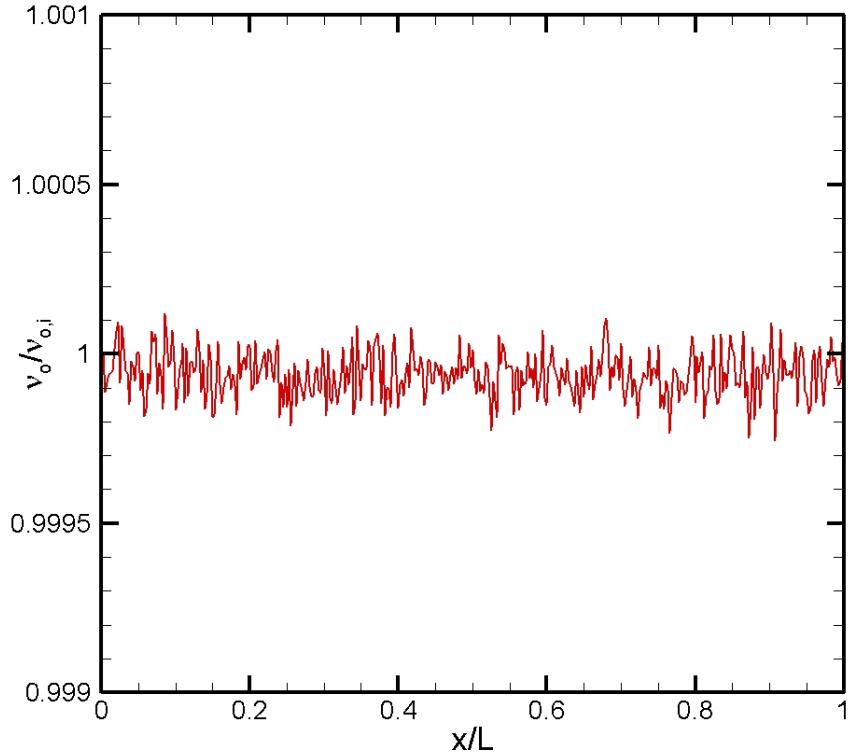


Collision Frequency in an Equilibrium Bath with Gravity

Normalized Density



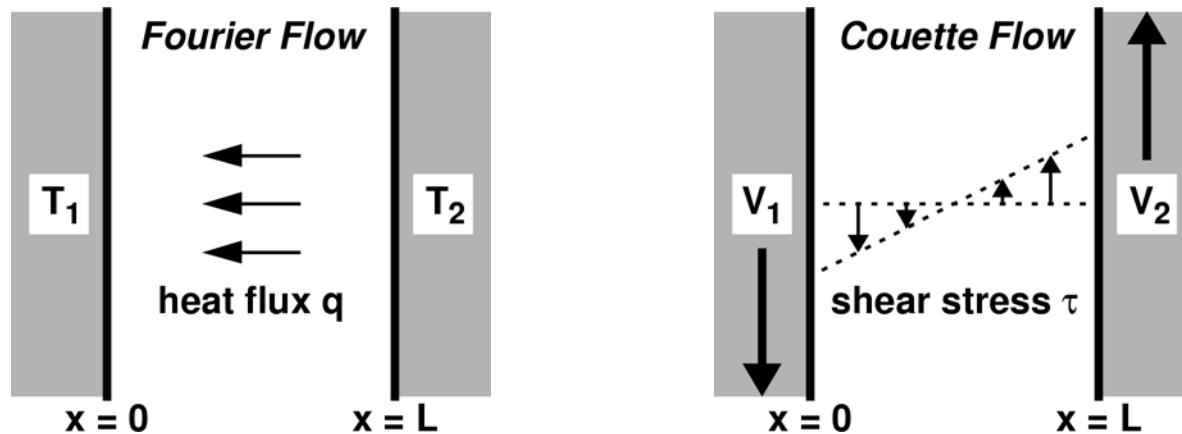
Collision Frequency Ratio



- Molecules HS “argon”
- Walls fully accommodating
- Width 0.001 m (1 mm)
- Pressure 264.9 Pa (~2 torr)
- Gravity $9.81 \times 10^4 \text{ m/s}^2 (10^4 \text{ g})$



Fourier-Couette Benchmark Flow

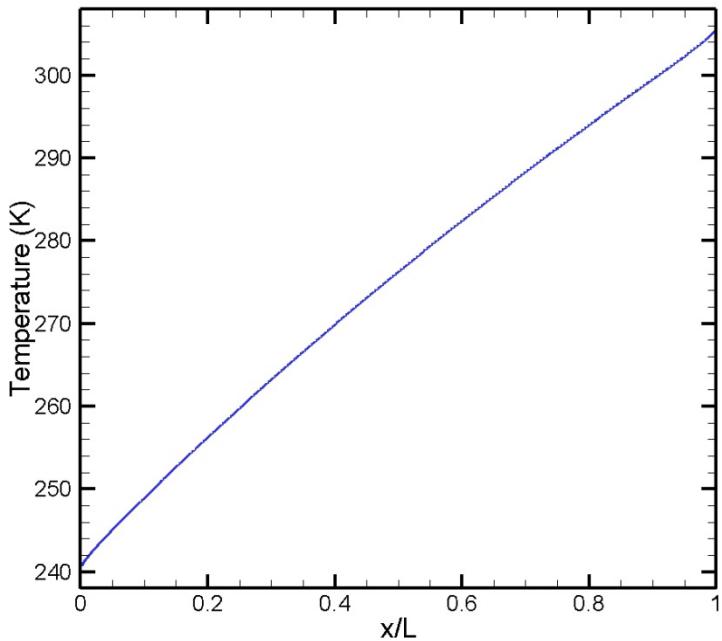


- Molecules VSS-Maxwell & HS “argon”
- Walls fully accommodating
- Width 0.001 m (1 mm)
- Pressure 264.9 Pa (~2 torr)
 - L/λ ~42
 - t_o 71 ns (at 273.15 K)
 - ΔT 70-400 K
 - ΔV 100 m/s



Comparing DSMC to Near-Equilibrium Theory

Temperature profile (velocity profile is similar)



- Nearly linear
- Near-continuum, small jumps near walls
- Low level of statistical scatter can be achieved

Chapman-Enskog and Moment Hierarchy theory
DSMC results

- Thermal conductivity, viscosity: K , μ

$$q = K_{DSMC} \left(\frac{\partial T}{\partial x} \right) \quad \tau = \mu_{DSMC} \left(\frac{\partial V}{\partial x} \right)$$

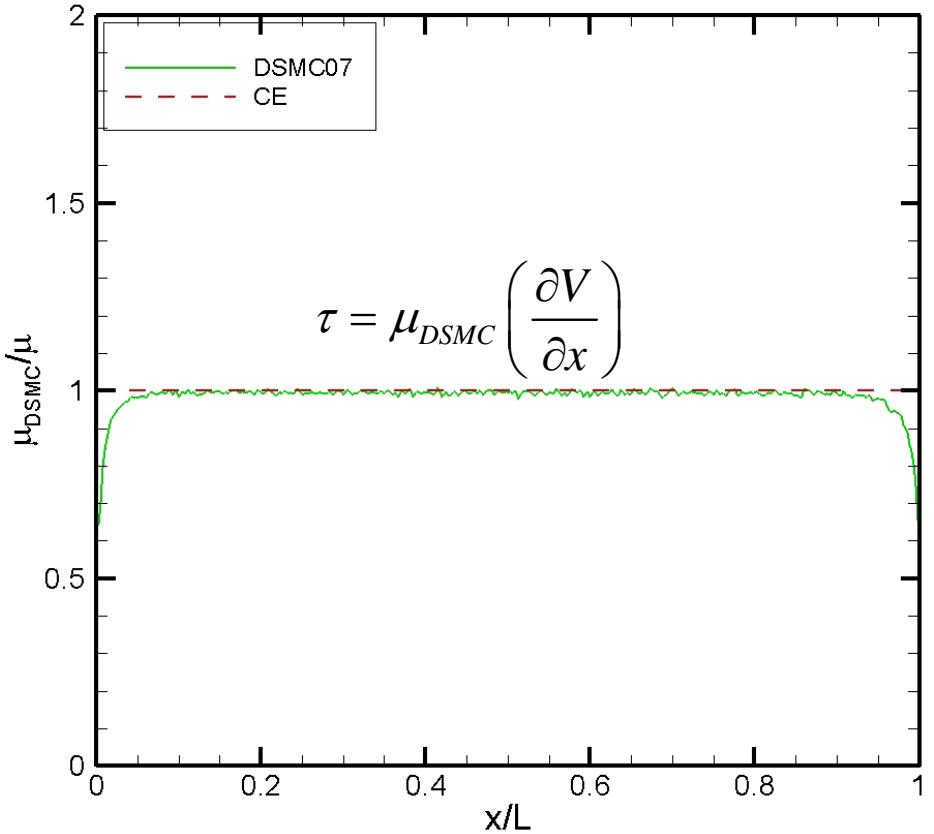
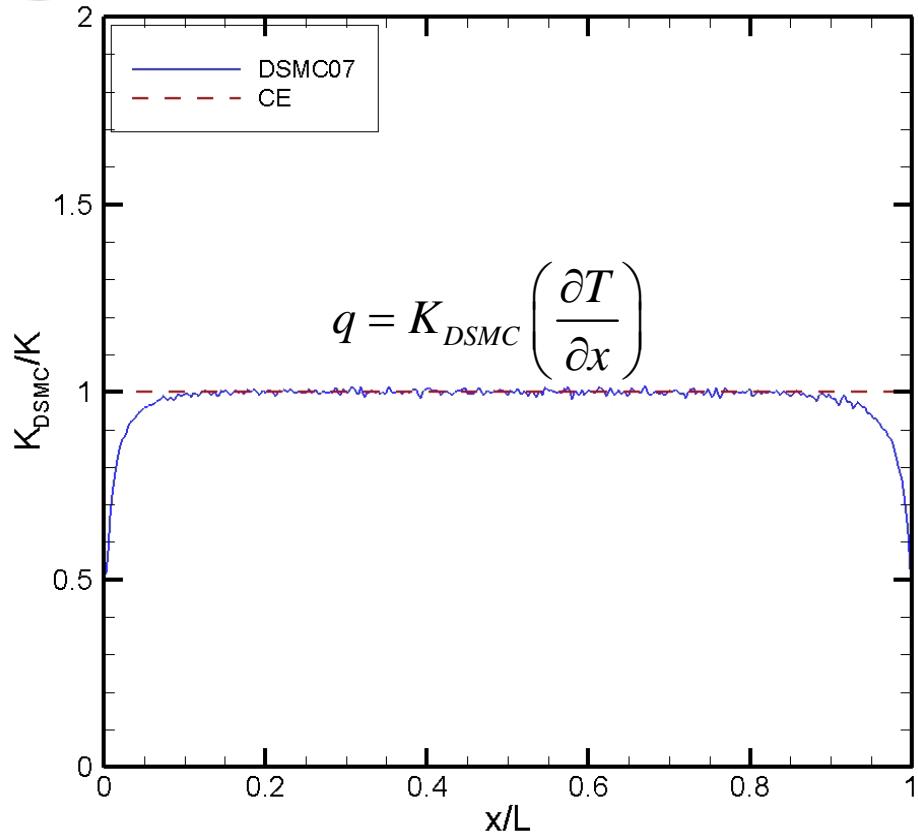
- Sonine polynomial coefficients: a_k/a_1 , b_k/b_1

$$\left(\frac{a_k}{a_1} \right)_{DSMC} = \sum_{i=1}^k \left(\frac{(-1)^{i-1} k! (5/2)!}{(k-i)! i! (i+(3/2))!} \right) \left(\frac{\langle \tilde{c}^{2i} \tilde{c}_x \rangle}{\langle \tilde{c}^2 \tilde{c}_x \rangle} \right)$$

$$\left(\frac{b_k}{b_1} \right)_{DSMC} = \sum_{i=1}^k \left(\frac{(-1)^{i-1} (k-1)! (5/2)!}{(k-i)! (i-1)! (i+(3/2))!} \right) \left(\frac{\langle \tilde{c}^{2(i-1)} \tilde{c}_x \tilde{c}_y \rangle}{\langle \tilde{c}_x \tilde{c}_y \rangle} \right)$$



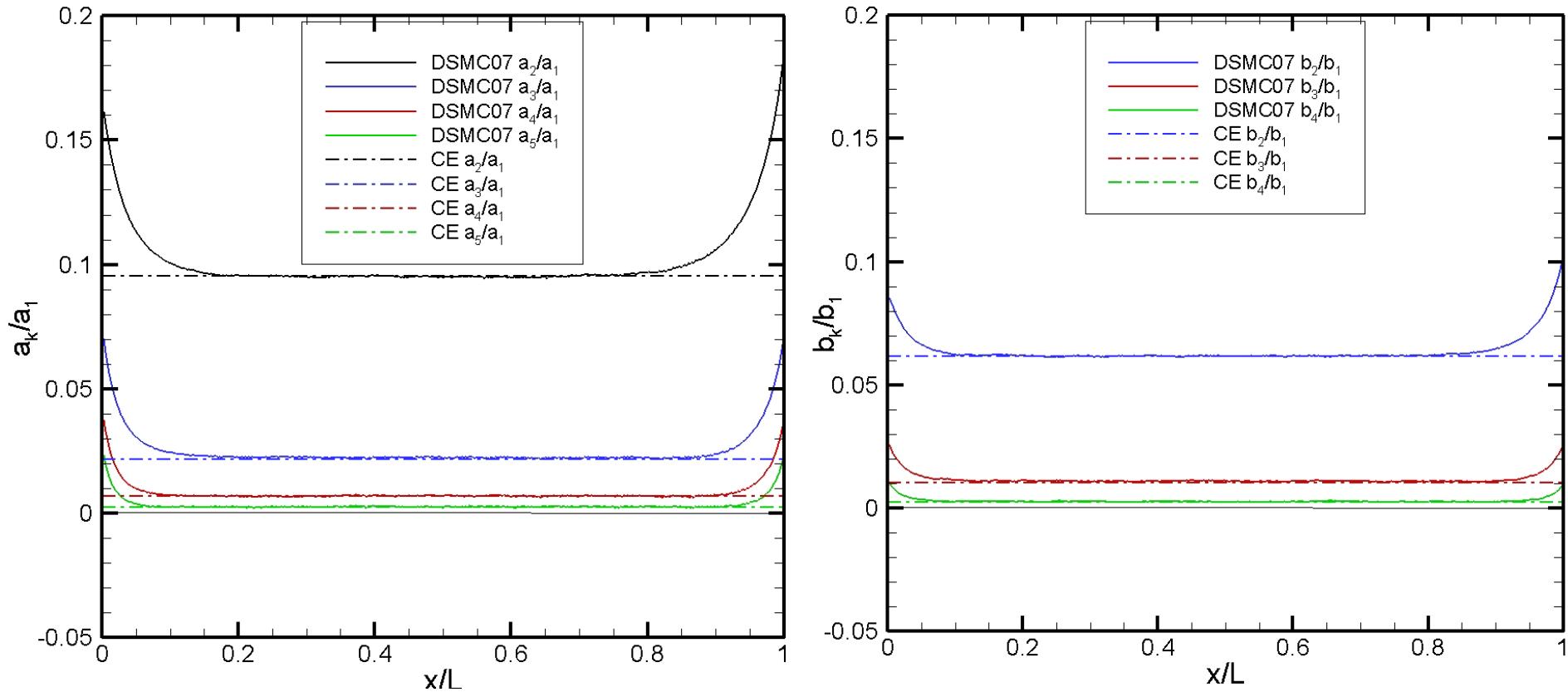
DSMC07: Hard-Sphere Transport Coefficient Profiles



- DSMC07 and CE thermal conductivity and viscosity
 - Low heat flux, low shear stress: $Kn_q = 0.006$, $Kn_\tau = 0.003$
 - Agreement in central region: normal solution
 - Demonstrates accuracy in capturing transport properties and non-equilibrium effects



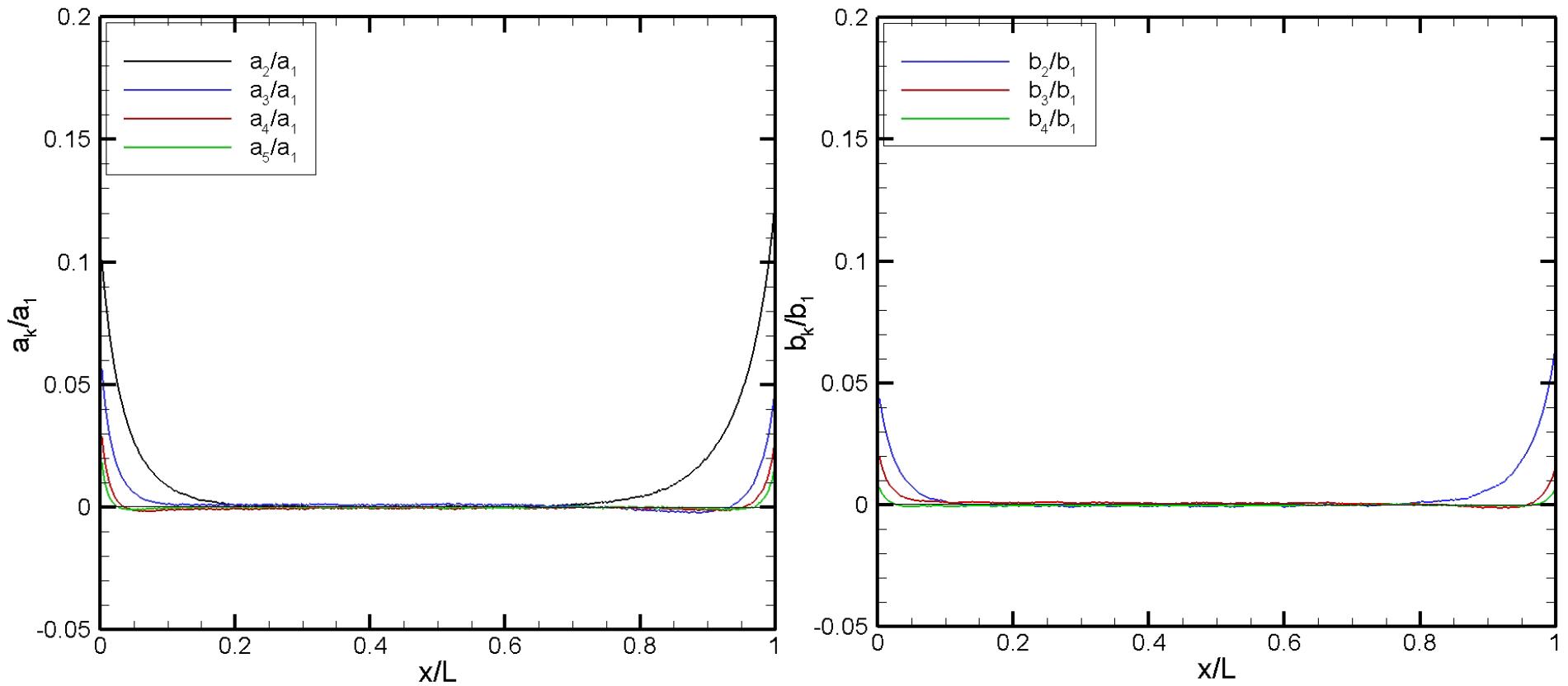
DSMC07: Hard-Sphere Sonine-Coefficient Profiles



- DSMC07 and CE Hard-Sphere Sonine polynomial coefficients a_k/a_1 and b_k/b_1
 - Low heat flux, low shear stress: $Kn_q = 0.006$, $Kn_\tau = 0.003$
 - Good agreement in central region: normal solution
 - Demonstrates accuracy of molecular velocity distribution



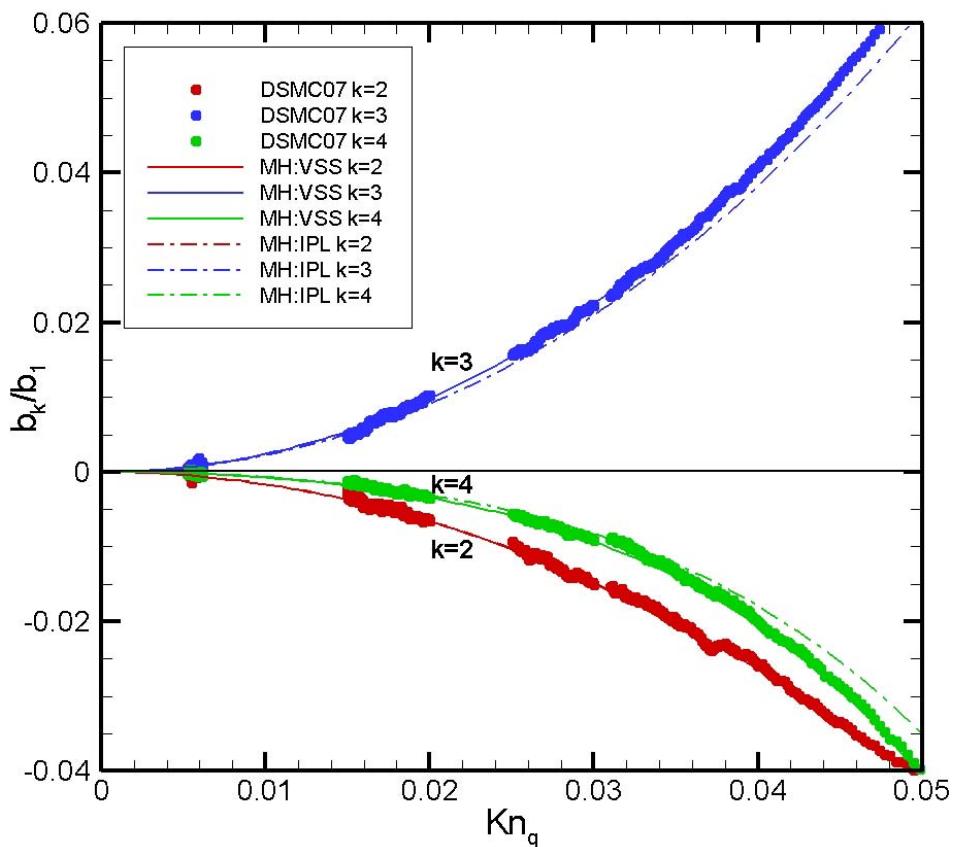
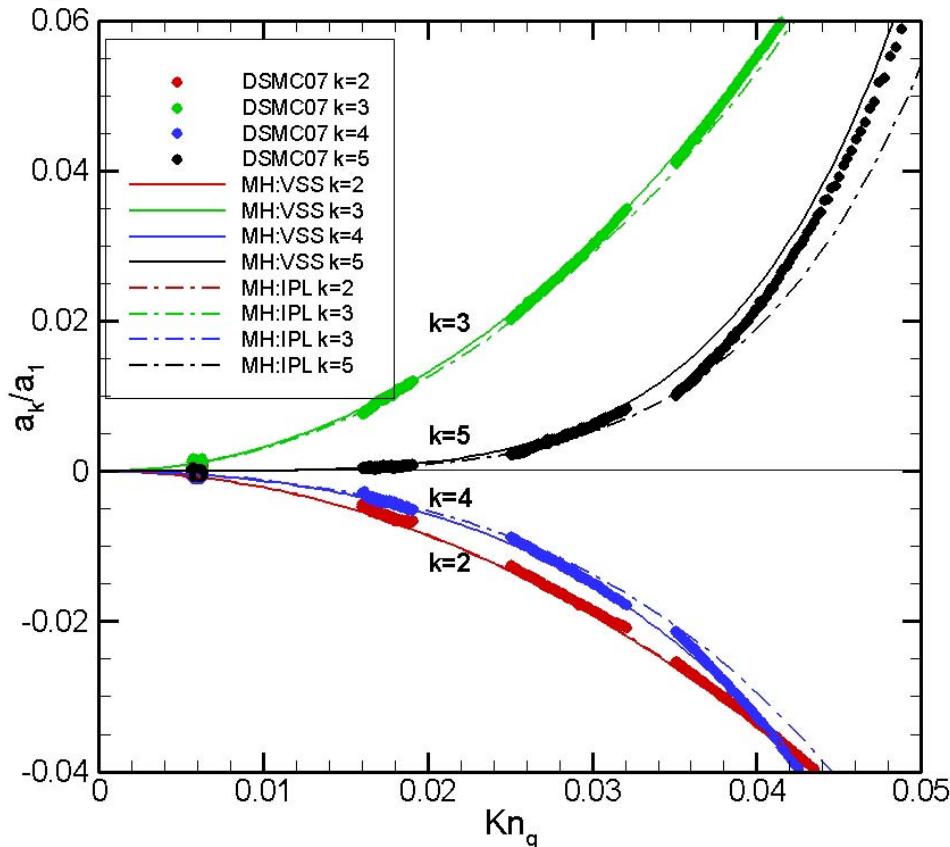
DSMC07: Maxwell Sonine-Coefficient Profiles



- DSMC07 and CE Maxwell Sonine polynomial coefficients a_k/a_1 and b_k/b_1
 - Low heat flux, low shear stress: $Kn_q = 0.006$, $Kn_\tau = 0.003$
 - Good agreement in central region: normal solution
 - Demonstrates accuracy of molecular velocity distribution



DSMC07: Maxwell Normal Sonine Coefficients

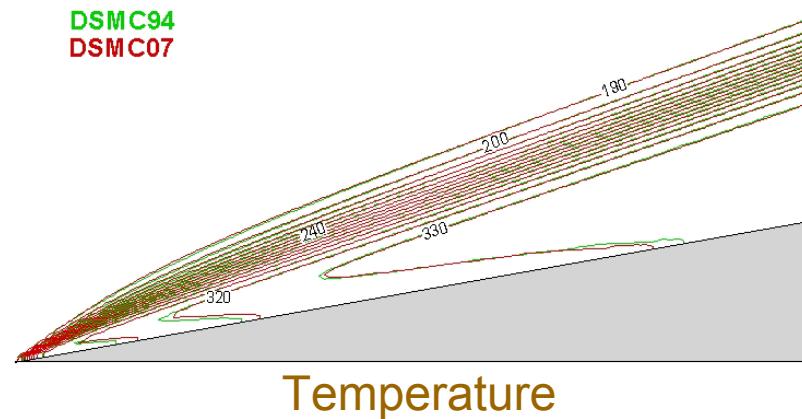
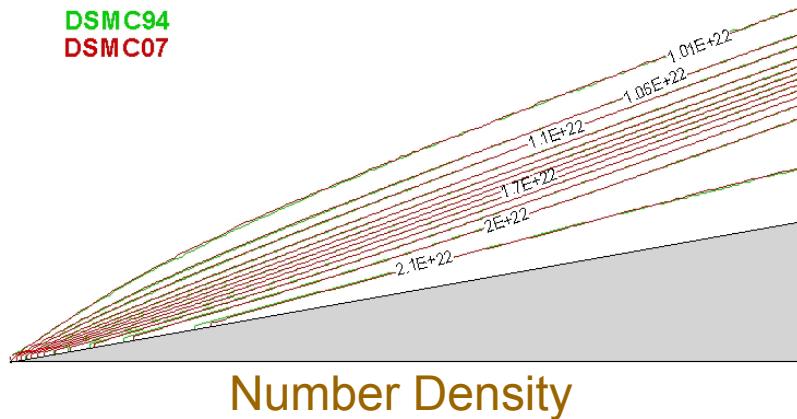


- DSMC07 and MH Maxwell normal solutions for a_k/a_1 and b_k/b_1
 - Four DSMC07 simulations: $\Delta T = 70, 200, 300, 400$ K
 - MH: VSS-Maxwell (solid) and IPL-Maxwell (dashed) differ
 - DSMC07 and MH VSS-Maxwell normal solutions agree



2-D Problem

Hypersonic Flow over a Wedge



Gas	Argon
Flow Speed	Mach 5.463
Pressure	25 Pa
Wedge Angle	10°
Shock Angle	19.6°

DSMC94 and DSMC07 are in agreement when the same simulation parameters are used

Downstream properties are in agreement with shock theory



Summary

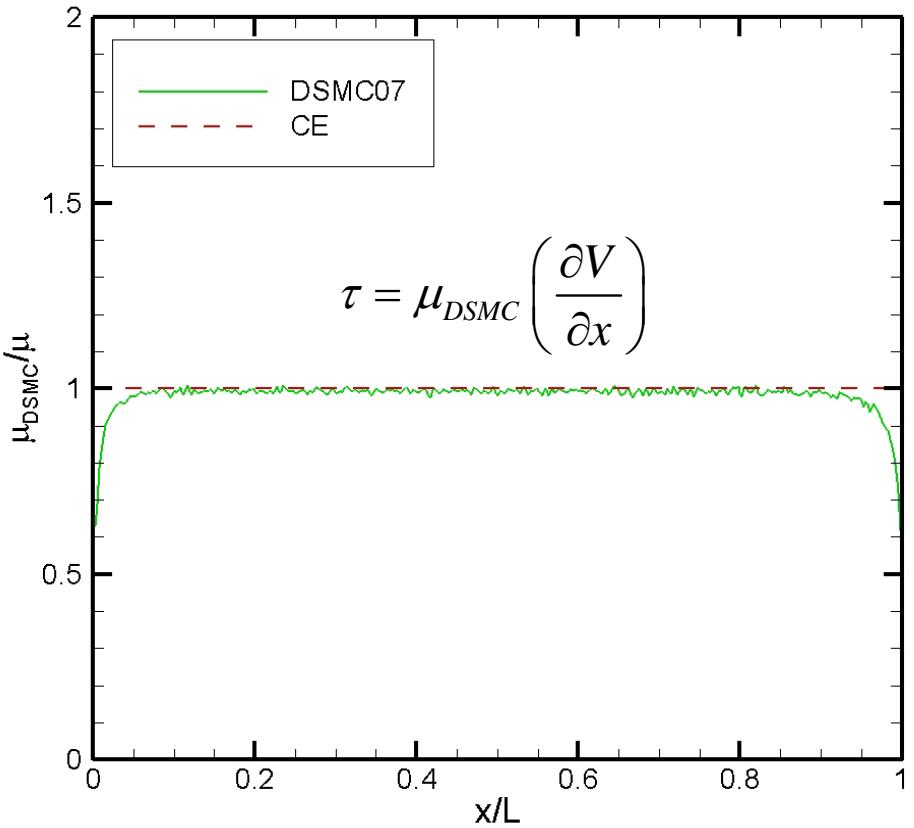
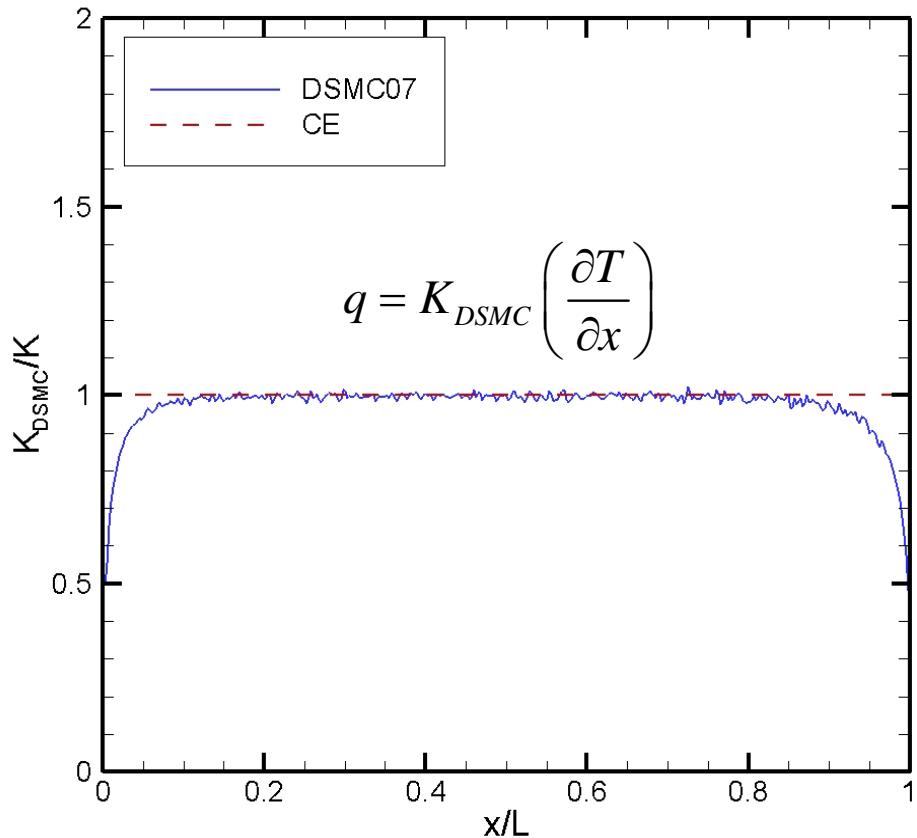
DSMC can reproduce the infinite-order solution to the Boltzmann equation.

There is a number of DSMC benchmark problems where analytical solutions exist.

Higher-order moments are progressively more difficult to capture.



DSMC07: Maxwell Transport Coefficient Profiles



- DSMC07 and CE thermal conductivity and viscosity
 - Low heat flux, low shear stress: $Kn_q = 0.006$, $Kn_\tau = 0.003$
 - Agreement in central region: normal solution