



# Implicit Thermochemical Nonequilibrium Flow Simulations on Unstructured Grids Using GPUs

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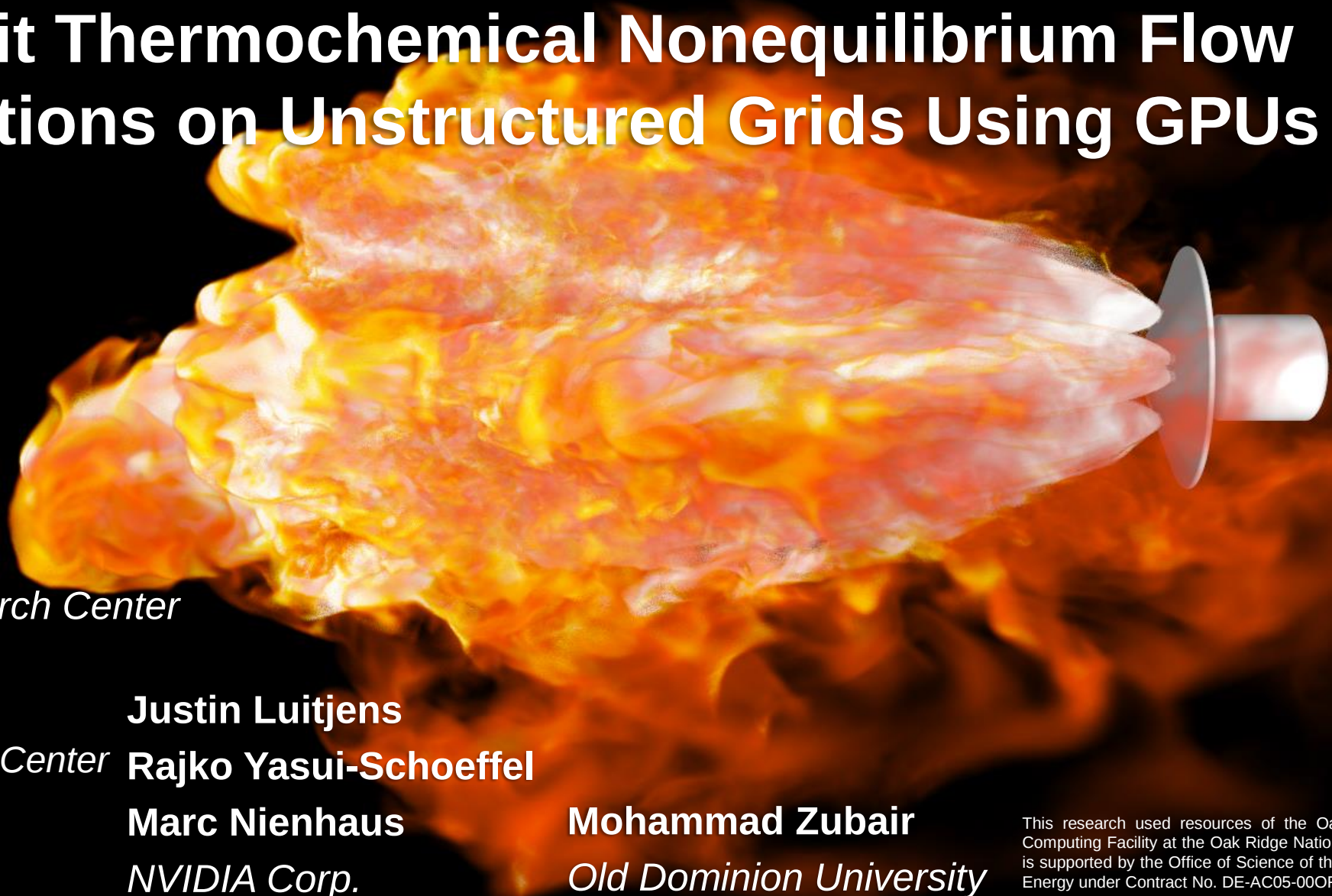
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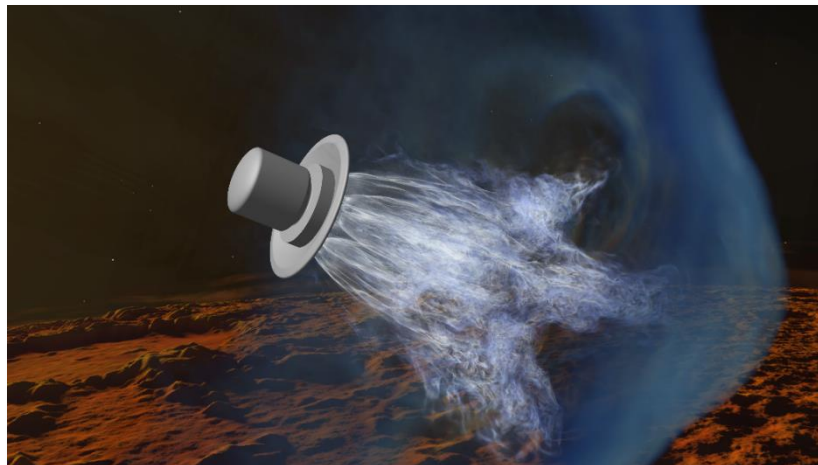
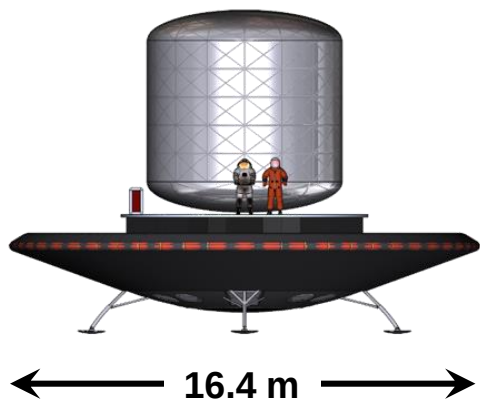
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# Motivation

- Current plans for U.S. exascale systems rely on GPU acceleration
  - 130 out of 500 fastest supercomputers (6 out of top 10) utilize GPU hardware
- Port to GPU architectures positions FUN3D, an unstructured-grid CFD solver, for this emerging landscape
  - Dramatically reduced run times enable early penetration of high-fidelity modeling
  - Ability to elucidate unprecedented physics – temporal, spatial, physical models
- The perfect gas path of FUN3D has been previously ported to NVIDIA Tesla GPUs
- Here we port the generic gas path of FUN3D, which models thermochemical nonequilibrium flows including atmospheric entry, hypersonics, and combustion
- Initial Mars atmospheric entry retropropulsion simulations will also be presented



## Current HPC Landscape

- 2. ORNL **Summit** (149 PF)
- 46. NASA **Pleiades** (6 PF)
- 53. NASA **Electra** (5 PF)
- 71. NASA **Aitken 2** (4 PF)
- 168. NASA **Aitken** (2 PF)

## New US Systems in 2021-2023

- ANL **Aurora** (1000 PF)
- ORNL **Frontier** (1500 PF)
- LLNL **El Capitan** (2000 PF)

Architecture: **CPU / GPU**

PF: PetaFLOPS, or  $10^{15}$  Floating-Point Operations Per Second



# Governing Equations and Numerical Implementation

- Conservation of species, momentum, energies, and turbulence variables
- Two-temperature model available for thermal nonequilibrium
- Spalart-Allmaras turbulence model with Catris-Aupoix compressibility correction; DES option
- Variable species, energies, and turbulence equations
- Node-based finite-volume approach on general unstructured grids
- Fully implicit formulations are used to integrate the equations in time
  - Sparse block linear system:  $A\mathbf{x} = \mathbf{b}$
  - Matrix  $A$  composed of diagonal and off-diagonal  $N_{eq} \times N_{eq}$  blocks
  - Memory and solution time increases as  $O(N_{eq}^2)$
- System solved with multicolor point-implicit approach

$$\begin{aligned}\frac{\partial}{\partial t}(\rho y_s) + \frac{\partial}{\partial x_j}(\rho y_s u_j) - \frac{\partial}{\partial x_j}(J_{sj}) &= \dot{\omega}_s \\ \frac{\partial}{\partial t}(\rho u_i) + \frac{\partial}{\partial x_j}(\rho u_i u_j + p \delta_{ij}) - \frac{\partial}{\partial x_j}(\tau_{ij}) &= 0 \\ \frac{\partial}{\partial t}(\rho E) + \frac{\partial}{\partial x_j}((\rho E + p)u_j) - \frac{\partial}{\partial x_j}\left(u_k \tau_{kj} + \dot{q}_j + \sum_{s=1}^{N_s} h_s J_{sj}\right) &= 0 \\ \frac{\partial}{\partial t}(\rho E_v) + \frac{\partial}{\partial x_j}(\rho E_v u_j) - \frac{\partial}{\partial x_j}\left(\dot{q}_{vj} + \sum_{s=1}^{N_s} h_{vs} J_{sj}\right) &= S_v \\ \frac{\partial}{\partial t}(\rho \tilde{v}) + \frac{\partial}{\partial x_j}(\rho \tilde{v} u_j) - \frac{\partial}{\partial x_j}\left(\frac{1}{\sigma} \left( \mu \frac{\partial \tilde{v}}{\partial x_j} + \sqrt{\rho} \tilde{v} \frac{\partial \sqrt{\rho} \tilde{v}}{\partial x_j} \right)\right) &= S_{\tilde{v}}\end{aligned}$$

$$\mathbf{q} = [\rho \vec{y}_s, \rho \vec{u}, \rho E, \rho E_v, \rho \tilde{v}]^T$$

$$\int_V \frac{\partial \mathbf{q}}{\partial t} dV + \oint_S (\mathbf{F} \cdot \mathbf{n}) dS - \int_V \mathbf{S} dV = \mathbf{0}$$

$$\left[ \frac{V}{\Delta \tau} \mathbf{I} + \frac{V}{\Delta t} \mathbf{I} + \frac{\partial \hat{\mathbf{R}}}{\partial \mathbf{q}} \right] \Delta \mathbf{q} = -\mathbf{R}(\mathbf{q}^{n+1,m}) - \frac{V}{\Delta t} (\mathbf{q}^{n+1,m} - \mathbf{q}^n)$$

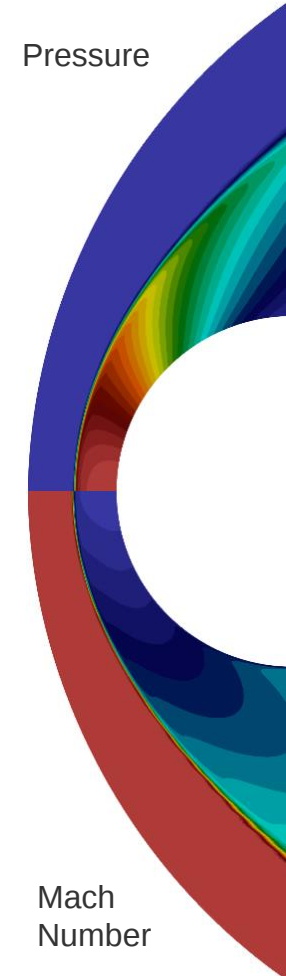
$$\mathbf{q}^{n+1,m} = \mathbf{q}^{n+1,m} + \Delta \mathbf{q}$$



# GPU Design Approach

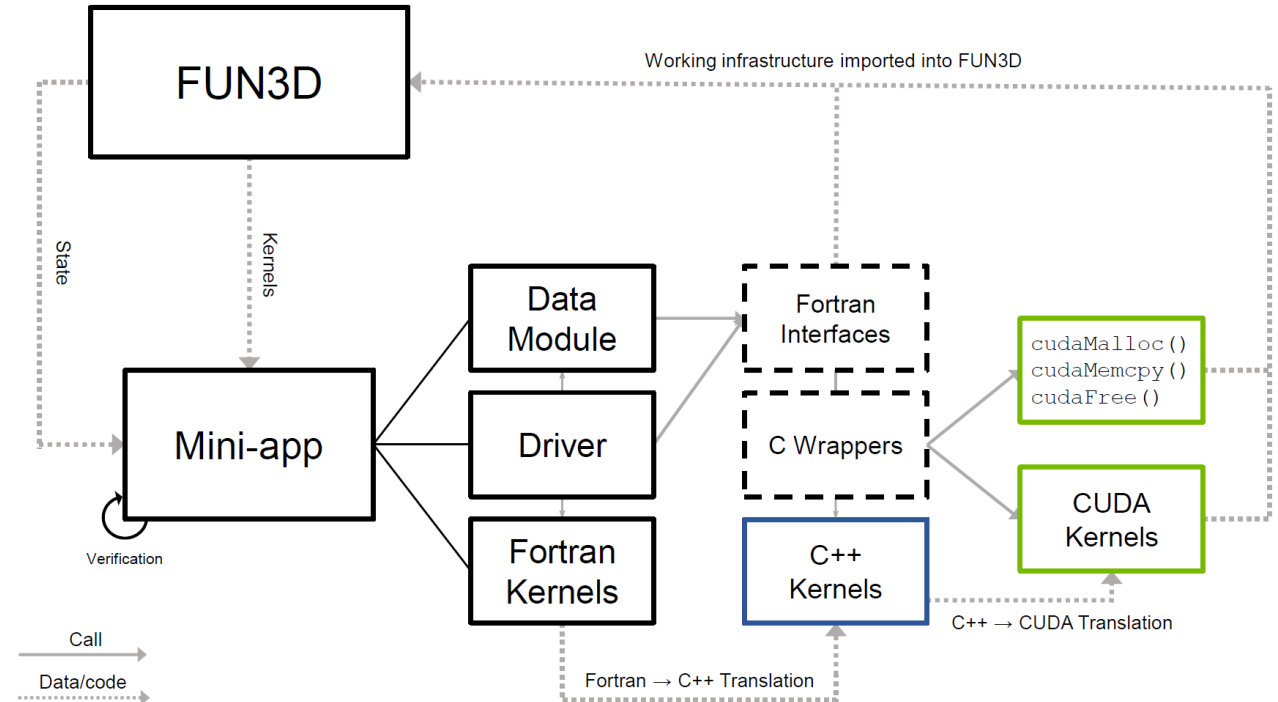
Hypersonic Cylinder  
 $M_\infty = 8.7$ , 5-species air

- Nomenclature: Host = CPU, Device = GPU
- FLUDA Library
  - CUDA C++ port of compute kernels in FUN3D
  - No external libraries are required
  - Use of library in FUN3D is controlled by a run-time parameter
- Preprocessing routines remain on the host
- All PDE kernels (~100) performed on the device
- Minimal data transfer between host/device (mainly scalars)
  - Large data motion only at user-specified frequencies (e.g., restarts, visualization support)
- Data structures are identical between CUDA and Fortran contexts
  - Column-major order array layouts
  - GPU “mirror” data structures that match CPU data structures
  - Variable precision is identical to CPU approach
    - FP64 for most variables, with mixed FP32/FP64 for linear algebra



## GPU Implementation

- Mini-app utilizes an entire state of FUN3D to perform a full iteration of the solve
- CPU and GPU kernels can be run at the same time and have outputs compared
- Once RMS norm of outputs is within specified tolerance ( $10^{-14}$  for FP64,  $10^{-7}$  for FP32), kernels are integrated into FUN3D
  - Most kernels match to machine precision
  - Individual FP values generally do not match to machine precision due to order-of-operations; further complicated by asynchronous execution
  - Behavior not unique to GPUs; also observed on CPUs with random loop permutations



## FUN3D mini-app structure and porting workflow

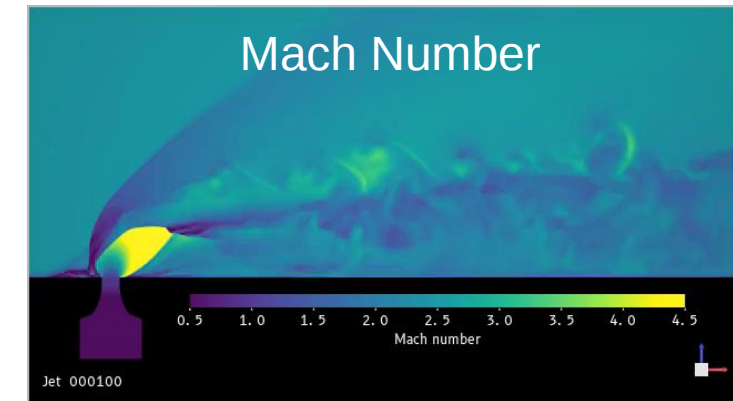
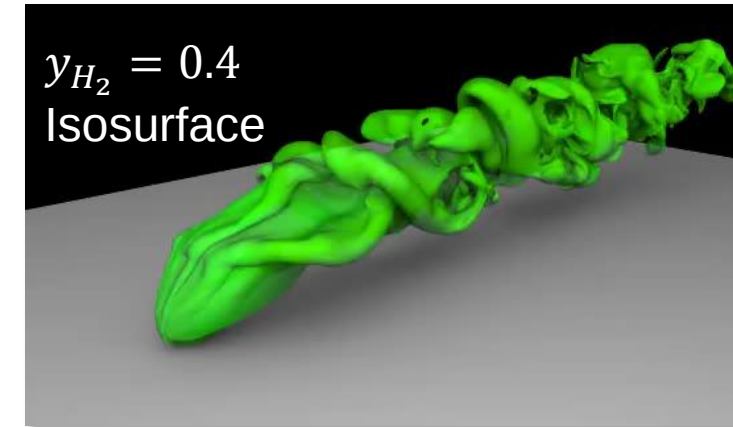


# GPU Optimizations

- Reduction of kernel state
  - Fortran implementation utilizes variable-length arrays (VLAs) for workspace
    - Since VLAs do not exist for CUDA, templating is extensively used
  - Initial naive CUDA port resulted in stack frames so large that the GPU ran out of memory immediately
  - To remedy this, multiple threads are assigned to a work item (such as a Jacobian) which reduces 2D arrays to scalars in many cases
  - Registers and shared memory are heavily used
- Reduce thread divergence
- Coalesced memory accesses
- Kernel launch parameter optimization
- See paper for more details:

Gabriel Nastac, Aaron Walden, Eric J. Nielsen, and Kader Frendi. "Implicit Thermochemical Nonequilibrium Flow Simulations on Unstructured Grids using GPUs," AIAA 2021-0159. AIAA Scitech 2021 Forum. January 2021.

Transverse Hydrogen Jet in  
Supersonic Cross Flow:  
 $M_\infty = 2.4$ , 9 species, DES

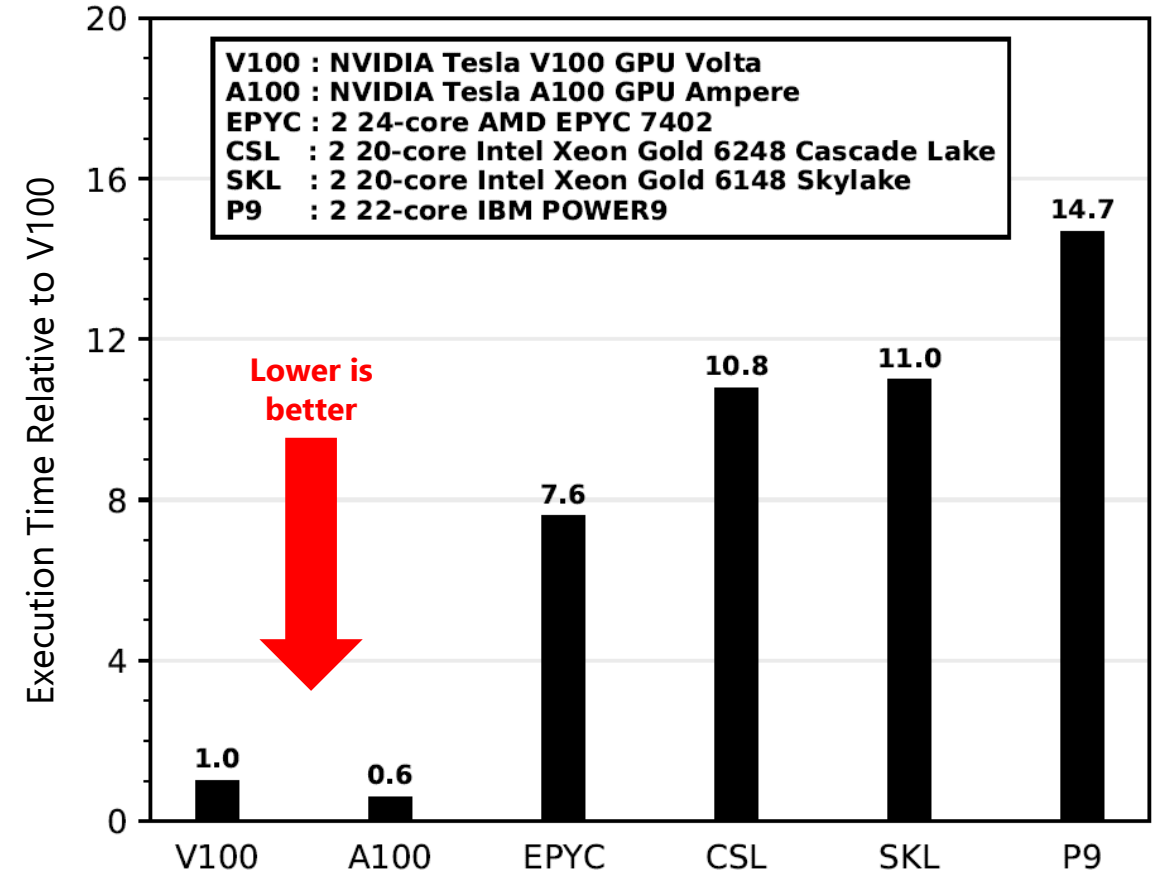


48 V100s ~ 20,000 Skylake Cores  
1 V100  $\approx$  417 Skylake cores 6



# Device Level Performance

- Memory-bound applications should exhibit speedups commensurate with hardware memory bandwidth ratio
  - E.g., perfect gas FUN3D shows 4.5x speedup for NVIDIA Tesla V100 over dual-socket Intel Xeon
- Generic gas CPU implementation is not optimal
  - Templates are not natively available in Fortran
  - Optimizations (e.g., reduction of workspace, transpose) have not been performed on CPU





# Retropropulsion for Human Mars Exploration

Human-scale Mars landers require new approaches to all phases of Entry, **Descent**, and Landing

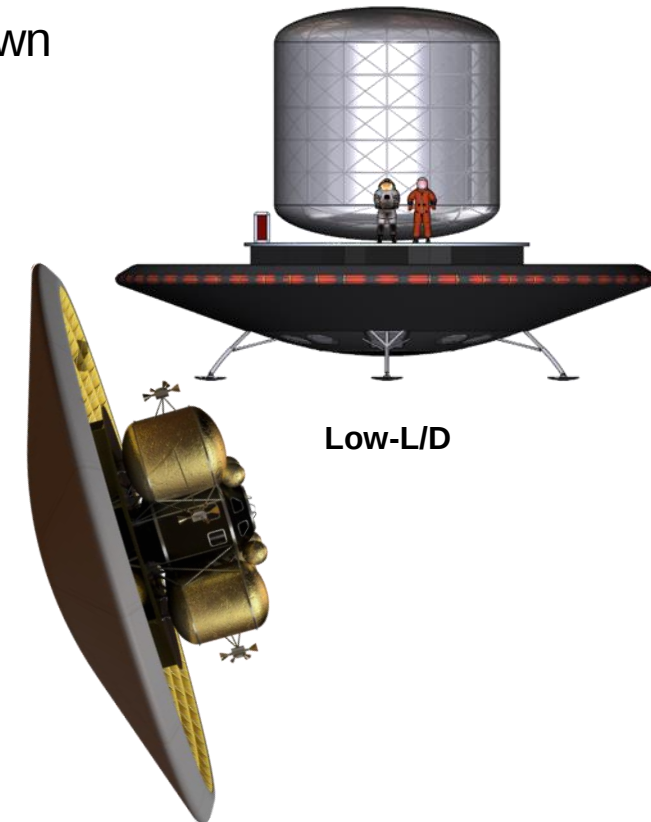
- Cannot use heritage, low-L/D rigid capsules → deployable hypersonic decelerators or mid-L/D rigid aeroshells
- Cannot use parachutes → retropropulsion, from supersonic conditions to touchdown
- No viable alternative to an extended, retropropulsive phase of flight

|                          | Viking                                                                              | Pathfinder                                                                          | MERs                                                                                | Phoenix                                                                              | MSL                                                                                   | InSight                                                                               | M2020                                                                                 |              |
|--------------------------|-------------------------------------------------------------------------------------|-------------------------------------------------------------------------------------|-------------------------------------------------------------------------------------|--------------------------------------------------------------------------------------|---------------------------------------------------------------------------------------|---------------------------------------------------------------------------------------|---------------------------------------------------------------------------------------|--------------|
| Entry Capsule (to scale) |    |    |    |    |    |    |    | 2 weeks ago! |
| Diameter (m)             | 3.505                                                                               | 2.65                                                                                | 2.65                                                                                | 2.65                                                                                 | 4.52                                                                                  | 2.65                                                                                  | 4.5                                                                                   |              |
| Entry Mass (t)           | 0.930                                                                               | 0.584                                                                               | 0.832                                                                               | 0.573                                                                                | 3.153                                                                                 | 0.608                                                                                 | 3.440                                                                                 |              |
| Parachute Diameter (m)   | 16.0                                                                                | 12.5                                                                                | 14.0                                                                                | 11.8                                                                                 | 19.7                                                                                  | 11.8                                                                                  | 21.5                                                                                  |              |
| Parachute Deploy (Mach)  | 1.1                                                                                 | 1.57                                                                                | 1.77                                                                                | 1.65                                                                                 | 2.2                                                                                   | 1.66                                                                                  | 1.75                                                                                  |              |
| Landed Mass (t)          | 0.603                                                                               | 0.360                                                                               | 0.539                                                                               | 0.364                                                                                | 0.899                                                                                 | 0.375                                                                                 | 1.050                                                                                 |              |
| Landing Altitude (km)    | -3.5                                                                                | -2.5                                                                                | -1.4                                                                                | -4.1                                                                                 | -4.4                                                                                  | -2.6                                                                                  | -2.5                                                                                  |              |
| Landing Technology       |  |  |  |  |  |  |  |              |
|                          | Retro-propulsion                                                                    | Airbags                                                                             | Airbags                                                                             | Retro-propulsion                                                                     | Skycrane                                                                              | Retro-propulsion                                                                      | Skycrane                                                                              |              |

Human-Scale Lander (Projected)

16 - 19  
40 - 65  
N/A  
N/A  
26 - 36  
+/- 2.0

Retro-propulsion



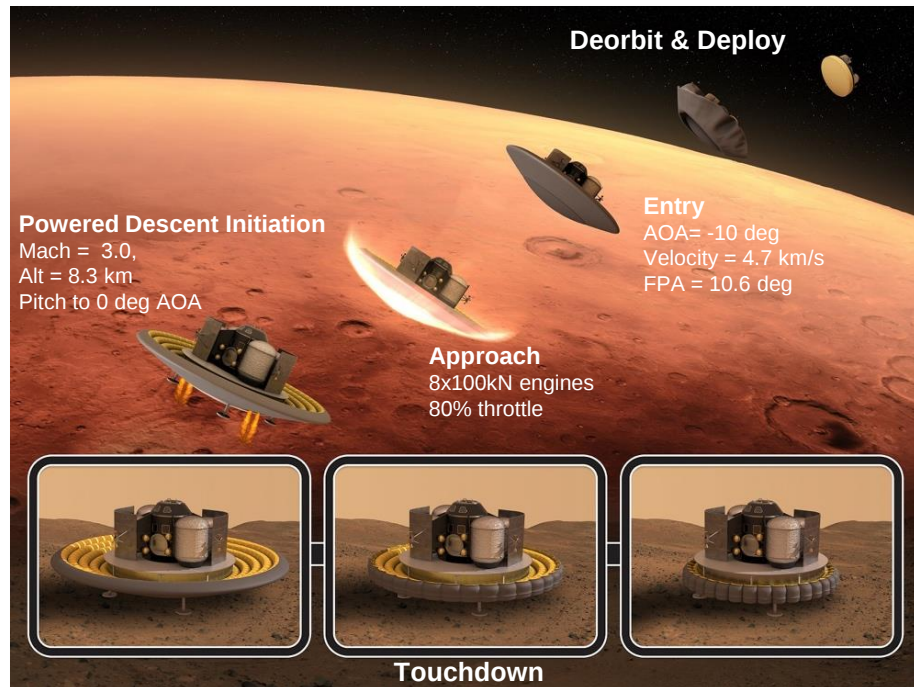
Steady progression of “in family” EDL

New EDL Paradigm



# Early Science 2018, INCITE 2019/2021 Efforts

## “Aero-Propulsive Real Gas Effects for Human-Scale Mars Entry”



Our previous Summit campaigns focused on perfect gas retropropulsion simulations

- Limited experiments on Earth are perfect gas

Our current efforts are exploring effects of reacting gas chemistry on these retropropulsion flows across the flight trajectory

- Methane combustion in Martian CO<sub>2</sub> atmosphere
- ~10x more expensive computationally

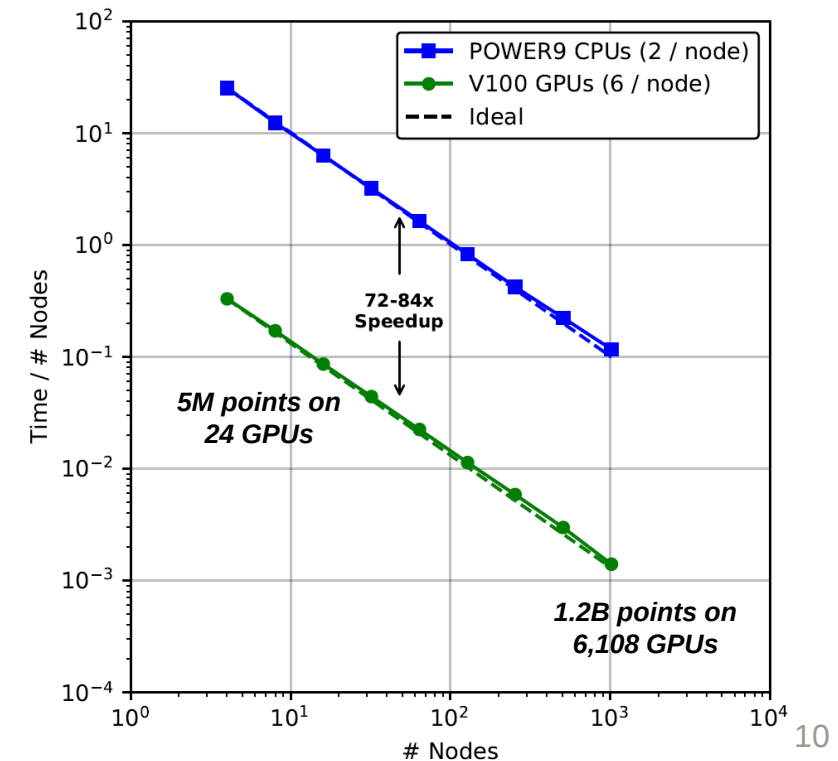
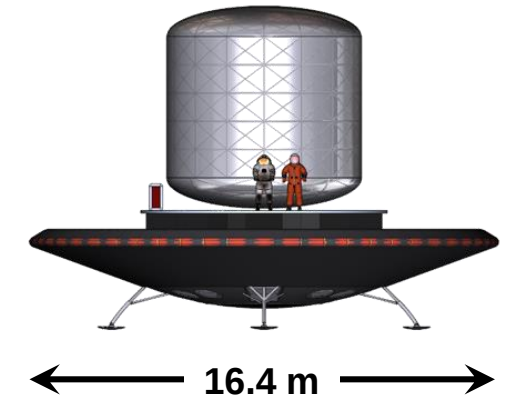
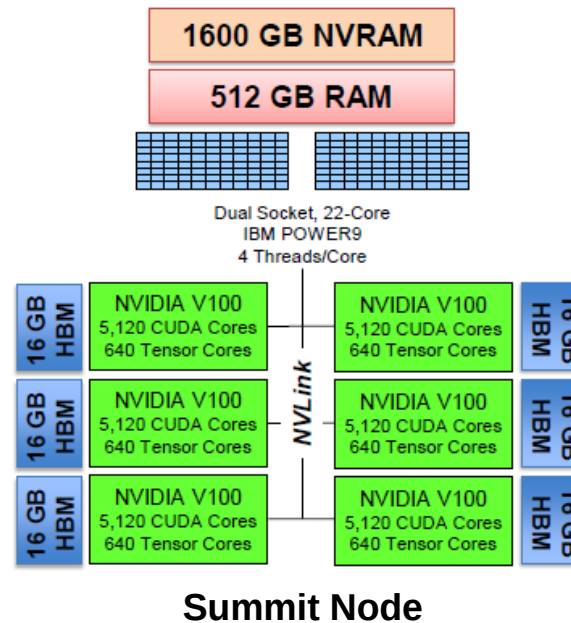
### Campaign Goals

- **Science:** Advance the understanding of retropropulsion flow physics during Mars EDL of a human-scale lander
- **Computational:** Demonstrate production readiness and efficiency advantages of GPU implementation of the FUN3D CFD code at scale



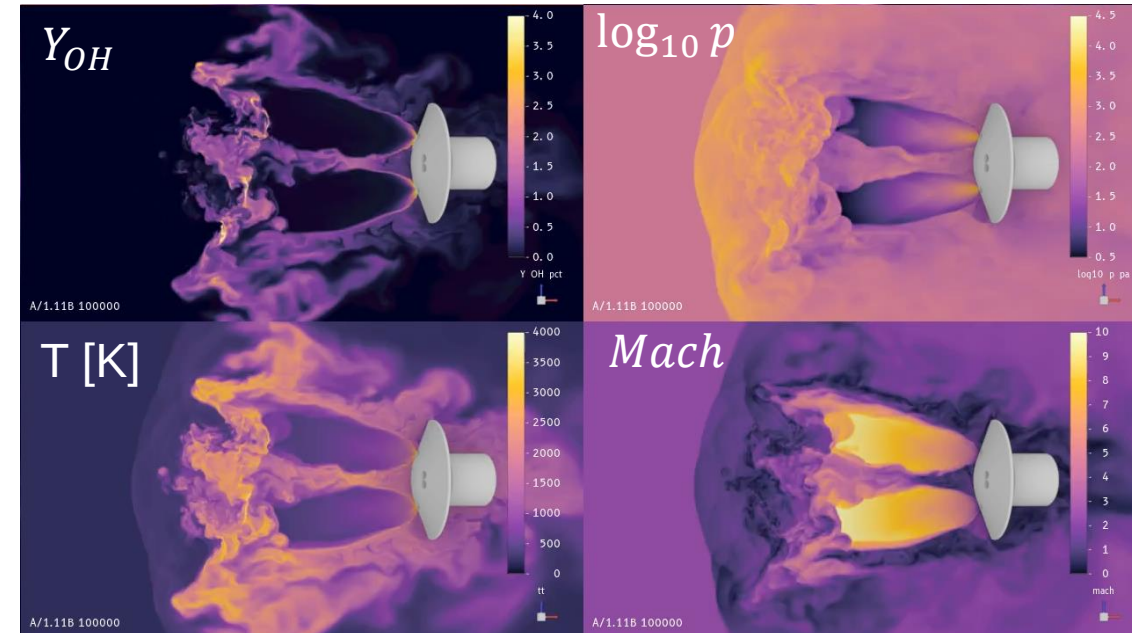
# Performance at Scale

- Weak scaling evaluated on Oak Ridge Summit system
- Node consists of 2 22-core IBM POWER9 CPUs, 6 NVIDIA Tesla V100 GPUs
- Each run places 1.2M grid points/node, or 200K grid points/GPU
- CPU- and GPU-only executions scale linearly
- GPUs retain ~75x node-level speedup at scale
- 1.2 billion points on 1,018 nodes
  - One physical time step with BDF2 takes about one second
  - Performance equivalent to several million CPU cores



# Summit Simulation Overview

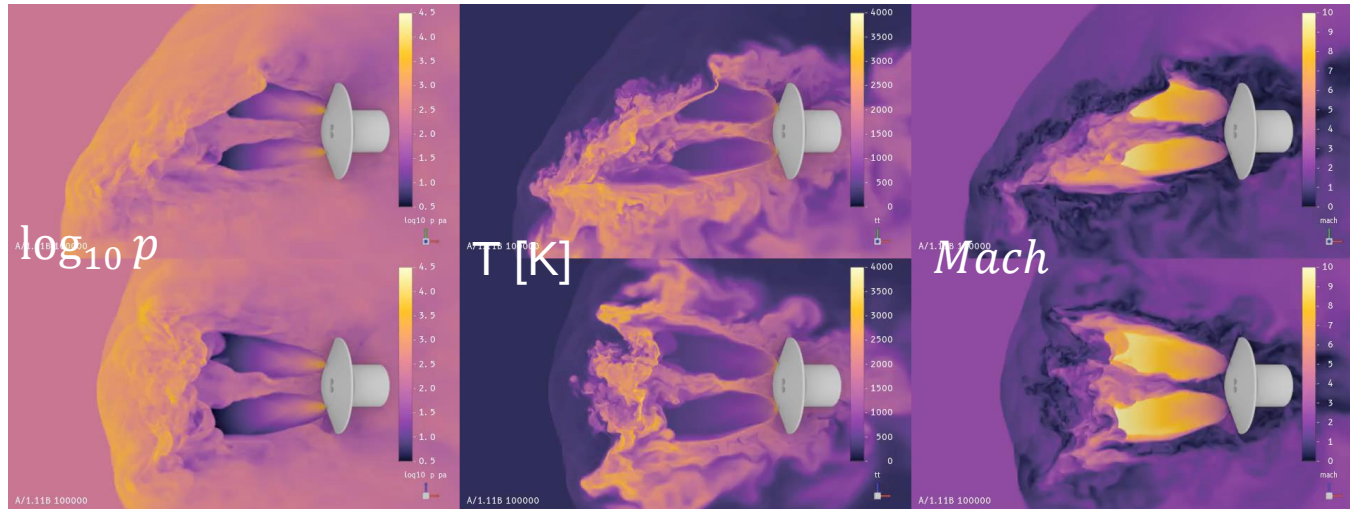
- $M_\infty = 2.4$ , Martian atmosphere freestream
- Eight Engine Plena:
  - Products of methane combustion
  - $T_0 \sim 3600\text{ K}$ ,  $p_0 \sim 80\text{ bar}$
- 10-species SA-Catris DES
- 6B cells, 1.1B nodes (~94% tetrahedra)
- 300k timesteps (5 subiterations per timestep)
  - Total integration time of ~2.5 seconds real-time
- 922 Nodes of Summit (5532 NVIDIA V100 GPUs)
  - 1.2~ seconds per timestep nominally
  - Estimated about 2.3 million Xeon Skylake cores to match performance
- Data Output
  - Saving 20 variables every 50 timesteps, 90+ GB per minute for the entire simulation of 100~ hours
  - Asynchronous I/O, less than 1% overhead (effectively free)
  - About 600 TB of data generated, data migration is nontrivial at this scale (50 TB/day to NASA from DOE)
  - Another goal of the campaign is to demonstrate in situ visualization with NVIDIA at this scale for unstructured grids





# Effect of Generic Gas on Retropropulsion

## Preliminary: Plume Asymmetry Investigation

**Mach 2.4, Generic Gas, Z-Plane****Mach 2.4, Generic Gas, Y-Plane****Mach 2.4, Perfect Gas**

Preliminary

| Parameter                     | Generic Gas / Perfect Gas <sup>1</sup> |
|-------------------------------|----------------------------------------|
| Axial Force Mean              | 1.7                                    |
| Axial Force Fluctuation       | 1.5                                    |
| Asymmetric Moment Mean        | 0.7                                    |
| Asymmetric Moment Fluctuation | 1.6                                    |

<sup>1</sup>Ashley M. Korzun, Eric Nielsen, Aaron Walden, William Jones, Jan-Reneé Carlson, Patrick Moran, Christopher Henze, and Timothy Sandstrom. "Computational Investigation of Retropropulsion Operating Environments with a Massively Parallel Detached Eddy Simulation Approach," AIAA 2020-4228. ASCEND 2020. November 2020.



# *Summary and Future Work*

- Generic gas path of FUN3D has been successfully ported, optimized, and verified for NVIDIA Tesla GPUs
- One NVIDIA Tesla V100 equivalent to ~400 Intel Xeon Skylake cores
- Benchmarks have been performed using over 6,000 GPUs with grids containing several billion elements
  - Performance equivalent to several million CPU cores
- Retropropulsion reacting flow simulations on grids of several billion elements are being performed at scale on Summit
  - Performance is maintained at scale with asynchronous I/O of full volume every minute
  - 90+ GB/min for 100 hours
- Other Summit campaign simulations at other points in descent trajectory
- Algorithmic improvements to solver to increase performance and lower memory requirements
- Adaptation of code base to other architectures used in future exascale machines