



Ignition of n-dodecane jets in a closed cylinder at 60bar, computed with PeleLMeX on Frontier

Pele Combustion: Early Frontier Runs and Beyond

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NASA Ames, Moffett Field, CA April 11, 2023





Overview of Presentation

- The Pele Suite of codes and analysis tools
- KPP2 Challenge and Demonstration Cases
- Porting details, performance
- Stretch goals and applications beyond our KPP



Pele Combustion Suite

Pele is the Exascale Computing Project's (ECP's) application suite for high-fidelity detailed simulations of turbulent combustion in open and confined domains

- Detailed physics and geometrical flexibility to evaluate design and operational characteristics of clean, efficient combustors for automotive, industrial, and aviation applications
- Targets simulation capabilities required to inform next-generation combustion technologies, for example:
 - Advanced internal combustion engines (e.g., RCCI)
 - Novel supercritical CO₂ power cycles
 - Rotating detonation engines
 - Supersonic cavity flame holders
 - Aviation combustors for sustainable drop-in JetA fuels
- Pele combustion simulation and analysis suite:
- PeleC (compressible), PeleLMeX (low Mach) reacting flow codes
- PelePhysics (thermodynamics, transport, chemistry models)
- PeleAnalysis (in-situ, post-processing/analysis)
- PeleMP [multi-physics] (soot, radiation, Lagrangian spray models)
- PeleProduction (collaboration hub)

Open-source code developed under the Exascale Computing Project: https://github.com/AMReX-Combustion

PeleC, PeleLM, PeleLMeX

PelePhysics

Transport, thermodynamics, finite-rate chemistry

AMReX-Hydro

Hydrodynamics and geometry

AMReX

Block-structured AMR library

SUNDIALS

Implicit/explicit ODE integrators

MAGMA

Batched linear solvers

HYPRE

Distributed linear solvers

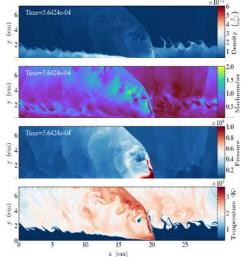




PeleC

Compressible flow solver

- Conservation of species mass densities, momentum, total energy
- Time-explicit Runge-Kutta (RK)-based advance
 - Time-explicit RK variants for diffusion and hyperbolics (PPM, PLM, WENO, MOL)
 - SUNDIALS-driven ODE integration for finite-rate chemical kinetics (CVODE, ARKODE)
- PelePhysics provides finite-rate chemistry models, equations of state and transport properties. Non-ideal thermo/chemistry modifications and tabulated lookup table models available
- PeleMP provides access to optional multiphase (spray) fuel models via AMReX particle capability
- https://github.com/AMReX-Combustion/PeleC



Rotating detonation engine Sreejith NA et al., 2022



Compression ignition in a high-pressure combustion chamber, computed on Frontier as part of Exascale Computing Program Challenge Problem, 2023



Supersonic cavity flame holder Sitaraman et al., Combustion and Flame, 2021



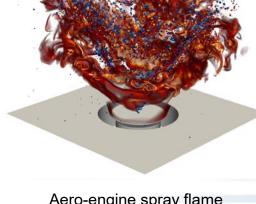
PeleLM(eX)

W=340

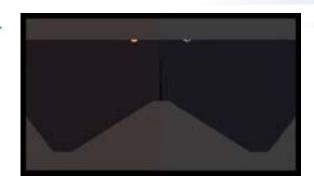
Gas turbine premixer, PeleLM M. Vabre, B. Savard, et al., CICS Spring Technical Meeting, 2022

Low Mach flow solver

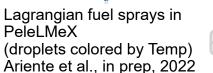
- Conservation of species mass densities, momentum, enthalpy
- Iterative/implicit variants of spectral deferred corrections time stepping for tightly coupled multiphysics systems – required for large dt enabled by the low Mach algorithm
 - Semi-implicit (Crank-Nicolson) diffusion, Godunov-based advection
 - SUNDIALS-driven ODE integration for finite-rate chemical kinetics (CVODE)
- PelePhysics provides finite-rate chemistry models, equations of state and transport properties.
 Tabulated lookup table and neural-net-based models available for turbulence/chemistry models
- PeleMP provides access to optional multiphase (spray) fuel models (Lagrangian, AMReX particles based), moment-based soot models, and radiation transport
- Critically, the low Mach model requires the solution of a linear elliptic system to compute the
 constrained spatially isobaric solution, and a set of linear systems for the implicit diffusion solve.
 Due to geometry-induced ill-conditioning, the elliptic systems often require HYPRE's
 BoomerAMG, with robustified, iterative smoothers
- PeleLMeX's non-subcycled integrator supports AMR with closed-chamber pressurization due to fueling and heat release



Aero-engine spray flame stabilization with SAF fuel (C1-ATJ), B Soriano, et al



Quad n-dodecane jets into KPP PB Wimer, Esclapez, et al., in prep, 2022



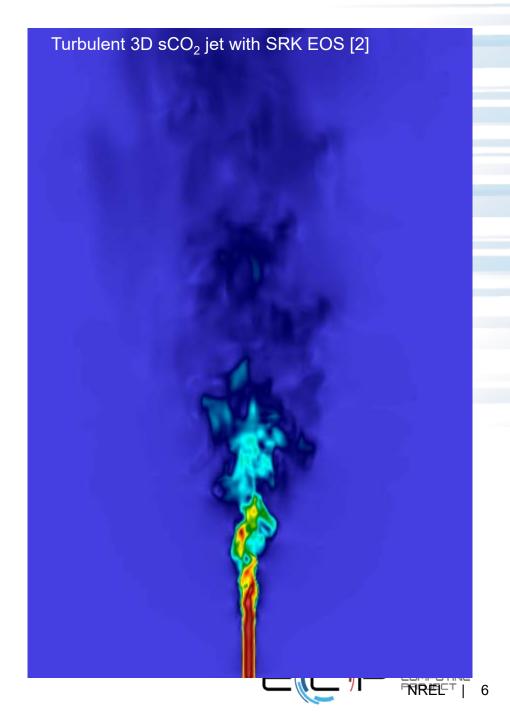




PelePhysics

An open-source combustion physics library

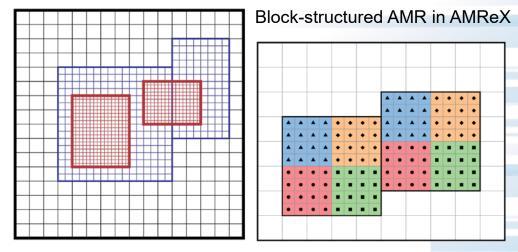
- https://github.com/AMReX-Combustion/PelePhysics
- EOS: ideal gas mixtures (CHEMKIN), Soave-Redlich-Kwong (SRK), EOS lookup tables / neural nets
- Models and parameters for thermodynamics
- Mixture-averaged and unity Le transport properties, including extensions for non-ideal gases
- Chemical reactions and finite-rate chemistry integration via SUNDIALS
- Python-based C++ generator to convert CHEMKIN combustion models into production rate and reaction Jacobian code for CPU/GPU evaluation, including optional quasi-steady-state assumptions (QSSA) for automated model reduction

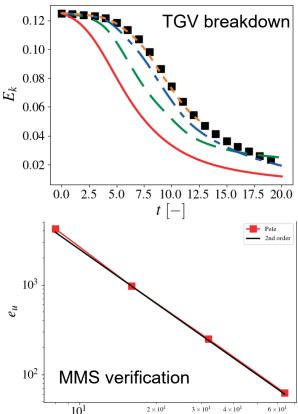


Pele Methods and Tools

All Pele tools exploit block-structured AMR

- We extensively leverage AMReX library (data structures, communication, parallelism, GPU acceleration, ...)
- Conservative cross-refinement finite-volume methods
 - PeleC: Time-explicit RK variants for diffusion and hyperbolics (PPM, PLM, WENO, MOL) with temporally split chemistry evolution
 - PeleLM(eX): Iterative/implicit SDC-variants for tightly coupled ADR systems resulting from large dt via the low Mach algorithm
- PeleC: Subcycling supports constant CFL time advance strategy across AMR hierarchy. PeleLMeX utilizes a non-subcycled time advance to support AMR with closed/pressurizing chambers
- Pele's CI supports formal design order verification through method of manufactured solutions (leveraging MASA library)
- AMR-aware in situ and post-processing tools (surface, slice and stream tubes/line extraction, high-dimensional sampling/statistics, CEMA and reaction path analysis, ROM/ML training, table/NN physics lookup, subsetting, demand-driven processing IO, etc.)





Combustion-PELE KPP2 Challenge Problem

Dual pulse injection of combustion fuels w/varying reactivity into engine-relevant geometry

- Baseline enabling simulations to isolate effects of spray evaporation on mixture composition and temperature, use of alternative fuels, and combustion phasing control
- Scoped to consume 2-4 weeks on a significant fraction (~75%) of Frontier's resources
- Geometry: Domain relevant to engine cylinder (see figure)
 - 2.5 cm, flat cylinder head, shaped piston surface
- **Fuel**: *n*-dodecane/methane QSS model (35 species)
 - Initial chamber gas: φ=0.4 CH₄ turbulent mixture, at 60 atm, 900K
 - Jets: Re=14k, mixture *n*-dodecane(45%):chamber-gas(55%)
- Strategy: 4 symmetric jets, dual pulse, gas-phase injection
- Resolution: 0.85 μm cells (due to 60 atm environment)
- Sim. Time: 1 msec (based on jet transit, ignition delay)
- Flow solver: PeleC (AMReX-based compressible reacting flow)
- AMR: 6 levels of factor-of-2 refinement
 - Level 0-6: volume = (100,23,8.5,1.7,1.1,0.76,0.56)%
 - Cell count/level = (0.03,0.06,0.8,0.3,1.5,8.4,49.5) B

Total cell count ~ 60B (2.4T dofs)





Measure of Capability to Perform Challenge Problem

Goal:

- Complete 30-60 min run with PeleC (compressible code) using 75% of available Frontier resources
- Allows confident extrapolation of ability to simulate the full challenge problem

Strategy/setup:

- Begin with a pre-evolved lower-resolution simulation of the same physical configuration to ensure sufficiently developed flow fields: jet mixing and penetration into domain, combustion ignition, etc.
- Restart with 3 additional factor-of-two refinement levels to reach full problem specification

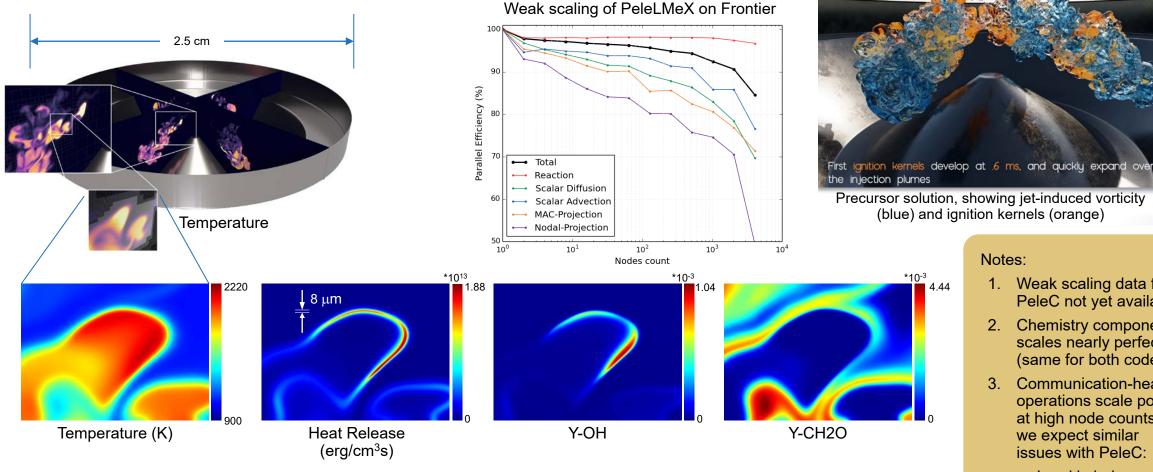
Expectations:

- A recent n-dodecane flame (1/300 scale) computed with PeleLM, required 230 sec for a 5 μs coarse-grid time step on 6000 Theta KNL cores. On 75% of Frontier, based on peak flops, we expect a reduction of 14.8X, or 15.5 sec time step, that is 5 ms simulated time / month
- Assuming 50% weak scaling efficiency loss, and a 10X reduction in CFL time step due to use of compressible (PeleC) vs. low Mach (PeleLM) model
- Estimated Frontier wall-clock resources: 0.2 ms/month (30 minutes to evolve solution 0.19 μs)

Achieved Performance: 0.12 μs physical time in 41 min wall-clock, using 7k Frontier nodes (2.2X slower than estimates)



Combustion-PELE KPP2 Challenge Run



7-Level AMR PeleC simulation

- Initial domain: 60atm, 900K, φ=0.4 CH₄ turbulent mixture
- Effective resolution: $(32,768)^2$ x 8192 with 0.6% of the domain at $dx_{Fine} = 0.85 \mu m$
- Four Re=14,000 fuel jets (45% n-dodecane, 55% initial chamber gas)

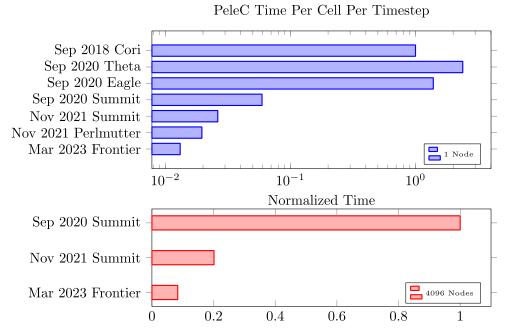
Notes:

- 1. Weak scaling data for PeleC not yet available
- 2. Chemistry component scales nearly perfectly (same for both codes)
- 3. Communication-heavy operations scale poorly at high node counts we expect similar issues with PeleC:
 - Load imbalance
 - Network-dependent

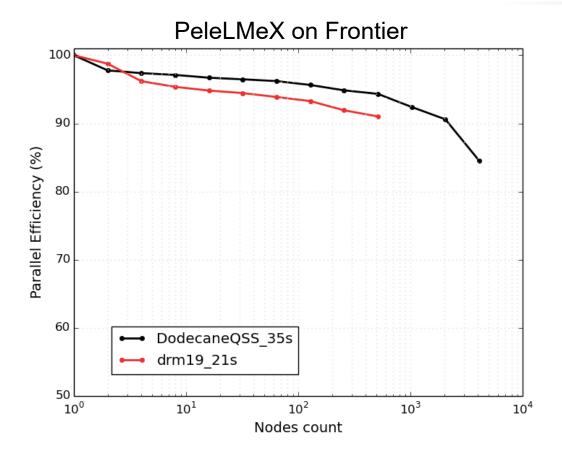


Running on Frontier - User experience

- PeleC: 75X performance gains over the last 4-5 years
- Stretch goals: PeleLMeX scaling on simpler problem:
 - Decent scaling results, 83% on 4096 nodes



PeleC time per cell per timestep from September 2020 code using drm19 21 species mechanism on Theta, Eagle, and Summit compared to November 2021 and March 2023 code using dodecane_lu 53 species mechanism on Summit, Perlmutter, and Frontier. 21 species case linearly scaled to approximate a 53 species run time.





Porting Pele codes to Frontier

Pele is a KPP2 project – Original software developed entirely under ECP

- First version of PeleC developed from CASTRO, a compressible Astro code
 - Mixed Fortran/C++ implementation, traditional for BoxLib/AMReX applications
 - Targeted many-core KNL architectures using MPI plus OMP offloading
- GPU ports
 - Initial PeleC was based on OpenACC, while preserving original Fortran/C++ structure
 - Simultaneously, AMReX developed a Kokkos-like portability layer
 - Pele codes were refactored to remove Fortran and use new AMReX layer
 - Initially used unified virtual memory (UVM) to simplify port, but UVM ultimately removed for performance on Frontier
 - Both implementations (CUDA, OpenACC) showed comparable performance
- Largest performance gains in Pele were via SUNDIALS chemistry implementation
 - Explicit RK-based solver replaced with implicit integrators, including CVODE+MAGMA



Performance Tuning of Pele

At the Pele level

- CEPTR, Pele's Python-based code generator for complex chemistry/thermos
 - Supports quasi-steady approximations (production=destruction), algebraic rather an ODE, expressions for evolution of minor species, considerably more complex and memory intensive Jacobian evaluations
 - Heavily refactored chemistry and thermo expressions to minimize thread private arrays and pre-compute, unroll complex evaluation code with user-controlled levels of subexpression reuse
- Expanded use of SUNDIALS interfaces to MAGMA, CVODE

At the AMReX level:

- Fused kernel launches allowed higher device throughput when using smaller AMR boxes
- Implementation of asynchronous ghost cell exchange



Pele Stretch Goals

- Low Mach Pele
- Turbulence and turbulence chemistry models
- Multiphase (spray) fueling
- Radiation
- Soot

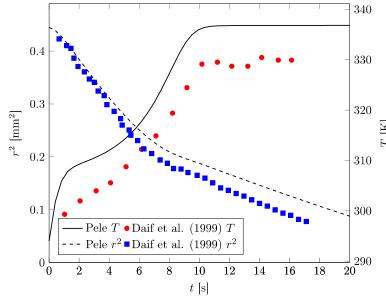


PeleMP: Overview

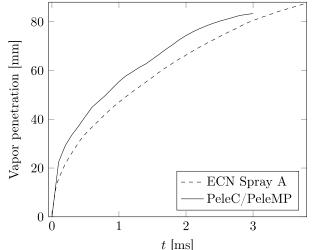
- Couples with the PeleC and PeleLMeX flow solvers
- Lagrangian dilute spray model
- Eulerian hybrid method of moments soot model
- Radiation: P1 gray gas model and the Planck-mean spectral model for the gas products and soot
- Hosted on GitHub as part of the AMReX-Combustion project
 - Github.com/AMReX-Combustion/PeleMP
- Documentation through GitHub Pages
- Pele flow solvers contain continuous integration for soot and spray functionality and coupling







Multi-component single droplet evaporation validated against experiment



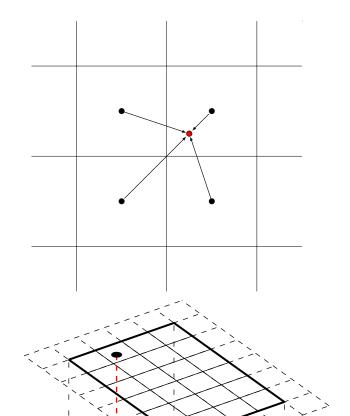
Vapor penetration over time validated

against ECN Spray A

PeleMP: Spray Modeling

- Assume droplets are spherically symmetric and spatially uniform
- Two-way coupled with Eulerian gas-phase
- Multicomponent liquid evaporation model
 - From Tonini, S. (2006), Doctoral Thesis
- Proper particle handling with AMR and EB
- Templated injection routines with droplet diameter distributions
- Verification and validation using single droplet and spray injection cases
- Weak scaling test: uniformly distributed convecting particles



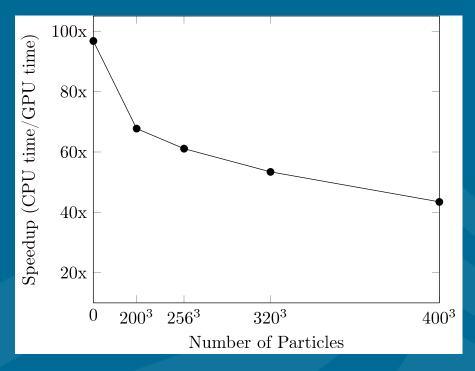


Lagrangian-Eulerian Coupling

- Two-way coupled with gas-phase
 - Interpolate gas phase state to parcel location
 - Distribute sources to nearest cell center
 - Mass, momentum, and energy source terms
- Special care when interacting with box patches and AMR
 - Virtual and ghost particles
 - Virtual particles: finer mesh particles copied to coarser mesh (red dot)
 - Ghost particles: coarser mesh particles adjacent to finer mesh boundary (blue dot)

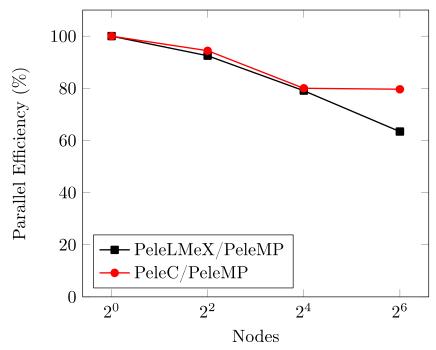


Performance of PeleMP sprays coupled with Pele



Comparing speedup between 8 nodes on Cori Haswell (CPU only) and 8 nodes on Summit (CPU/GPU)

Summit has 6 NVIDIA V100 GPUs per node



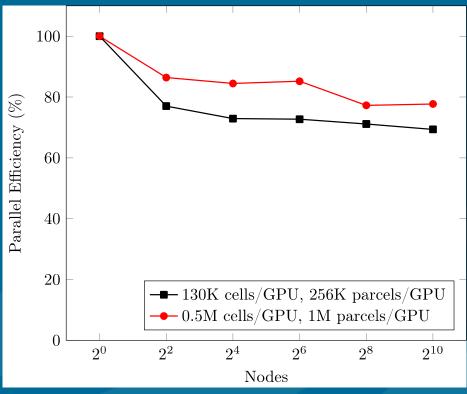
Weak scaling of PeleMP coupled with PeleC and PeleLMeX on Crusher; 262K cells/GPU and 512K parcels/GPU

Crusher has 4 AMD MI250X per node with 2 graphic compute dies each

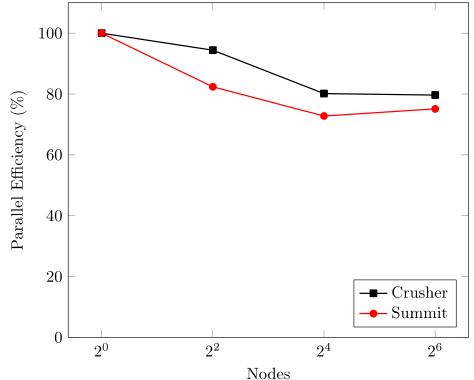




Performance of PeleMP sprays coupled with PeleC and PeleLMeX

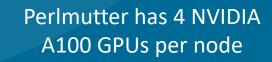


Weak scaling of PeleC/PeleMP on Perlmutter



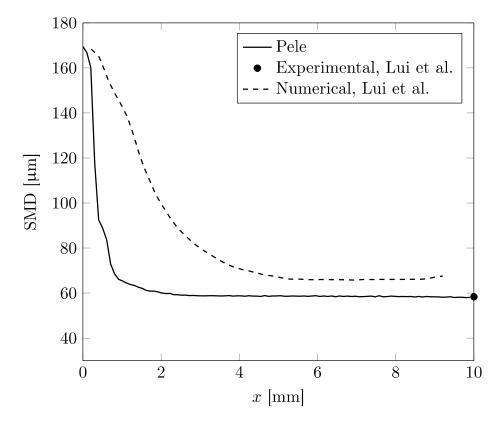
Weak scaling of PeleC/PeleMP on Crusher and Summit; 262K cells/GPU and 512K parcels/GPU







Upcoming Spray Capabilities



16 m/s jet in 72 m/s air crossflow using KHRT breakup model

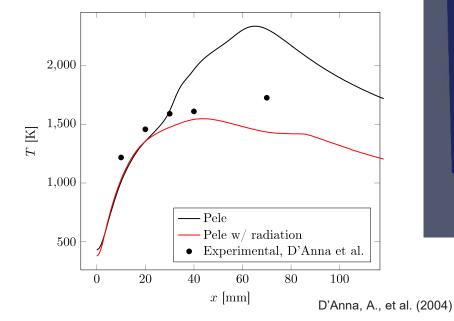
Lui, A., et al. SAE Technical Paper 930072 (1993)



- KHRT breakup model
 - Patterson, M. A. and Reitz, R. D. (1998)
 - Verification using jet in crossflow configuration
- ETAB breakup model
 - O'Rourke, P. J. and Amsden, A. A. (1987)
 - Tanner, F. (1997)
- Splash model
 - Ahamed, S. et al. (2022)
- Wall film evaporation model
 - O'Rourke, P. and Amsden, A. A. (1996)

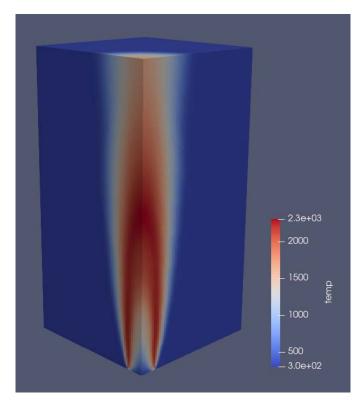
1,600 1,400 1,200 1,000 1

Ethylene 1D burner simulation



Ethylene co-flow centerline temperature

Soot and Radiation Modeling



Ethylene 3D co-flow temperature

- Eulerian hybrid method of moments (HMOM)
 - Mueller et al. Combust. Flame (2009)
- Requires precursor chemical species in chemical mechanism – pyrene, napthalene
- Radiation: P1 gray gas model and the Planck-mean spectral model for the gas products and soot



Beyond PELE's Stretch Goals

Reacting flows are an integral part of key technologies for the energy transition and circular economy for materials

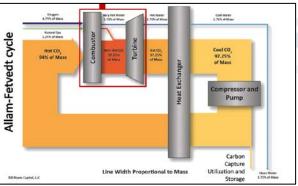
- Sustainable aviation
- Oxy-combustion w/ Carbon sequestration
- Biomass processing
- Pyrolytic recycling of polymers
- Green steel, cement and chemical production

Simulations are necessary to advance and deploy these technologies

- Exascale computing: unprecedented ability for high-fidelity simulation, generating immense volumes of data
- Evaluation of chemical kinetics can be >90% of computational intensity

Objective: use data generated from exascale scientific simulations to generate low-cost models that can be used to accelerate engineering calculations







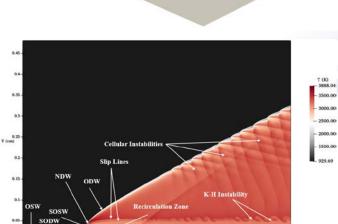


PeleC and PeleLMeX community code for turbulent reacting flows with multi-physics addressing climate mitigation and national security challenges

- Certifying sustainable aviation fuels for propulsion
- Enabling clean efficient dispatchable power generation with hydrogen and hydrogen blends in existing infrastructure
- Enabling chemical manufacturing with low energy heat sources from plasma catalysis (DOE Industrial Heat Shot Earthshot)
- Creating digital twins of hypersonic nonequilibrium reacting flows
- Reliably powering unmanned aerial systems with fuel diversity

Complex multi-physics insights in reactive flows and high-fidelity data for reduced-order models

Aero-engine spray flame stabilization with SAF fuel (C1-ATJ)



Mach 10 oblique detonation with nonequilibrium H₂/O₂ chemistry



Scramjet cavity stabilized flame



LES Models in PeleLMeX

 Subfilter momentum and scalar transport terms closed with gradient-transport models:

$$\begin{array}{ll} \text{Scala} & \text{Momentu} \\ \text{rs} & \tau_{\text{IJI}} = \left(\bar{\rho} \widetilde{u_i} \widetilde{u_j} - \bar{\rho} \widetilde{u_i} \widetilde{u_j}\right), \qquad \widetilde{S}_{ij} = 1/2 \left(\frac{\partial \widetilde{u}_i}{\partial x_i} + \frac{\partial \widetilde{u}}{\partial x_j}\right) \\ & \widetilde{\rho} \widetilde{u_j} \widetilde{\phi} - \bar{\rho} \widetilde{u}_j \widetilde{\phi} = -\frac{\mu_t}{\text{Sc}_t} \frac{\partial \widetilde{\phi}}{\partial x_j} & \tau_{ij} - \frac{1}{3} \tau_{kk} \delta_i j \approx -2 \mu_t \left(\widetilde{S}_{ij} - \frac{1}{3} \delta_{ij} \widetilde{S}_{kk}\right) \end{array}$$

 Smagorinsky and Wall-Adapting Local Eddy Viscosity (WALE)^[1] models implemented in PeleLMeX

Smagorinsky

$$\mu_t = (C_sar{\Delta})^2 |\widetilde{S}|$$

Nominal Value:

$$C_s = 0.18 \text{ (Cs1x)}$$

Also evaluate:

$$C_s = 0.09$$

(Cs0.5x)

 $C_{\rm s} = 0.36 \, ({\rm Cs2x})$

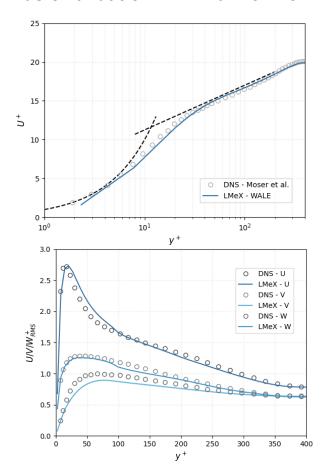
WALE

$$\widetilde{S}_{ij}^d = rac{1}{2} \left(\left(rac{\partial \widetilde{u}_i}{\partial x_j}
ight)^2 + \left(rac{\partial \widetilde{u}_j}{\partial x_i}
ight)^2
ight) - rac{\delta_{ij}}{3} \left(rac{\partial \widetilde{u}_k}{\partial x_k}
ight)^2$$

$$\mu_t = (C_m \bar{\Delta})^2 \frac{\left(\widetilde{S}_{ij}^d \widetilde{S}_{ij}^d\right)^{3/2}}{\left(\widetilde{S}_{ij} \widetilde{S}_{ij}\right)^{5/4} + \left(\widetilde{S}_{ij}^d \widetilde{S}_{ij}^d\right)^{5/2}}$$

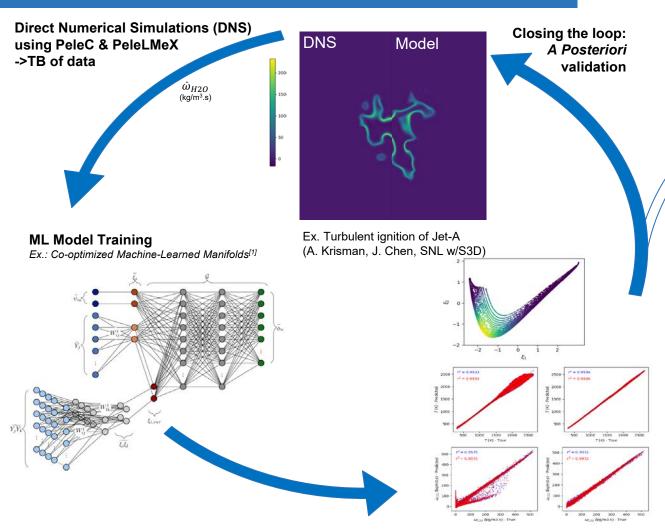
$$C_m = 0.60$$

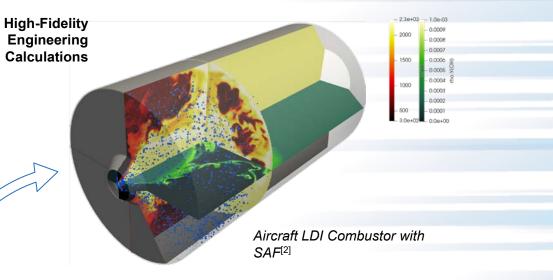
Basic validation: 1D Channel Flow





Manifold Models & ML in Pele





Leverage data from high-fidelity simulations to improve reducedorder manifold chemistry models

Implement reduced-order manifold capability in Pele codes to enable a posteriori validation and engineering simulations, e.g. for SAF combustion

General Implementation: Allow for both physics- and data-based manifolds

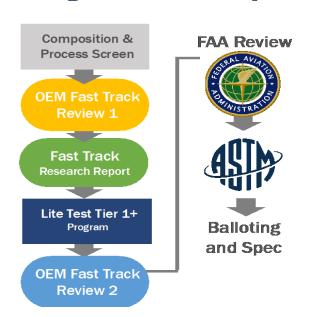
A Priori Model Validation



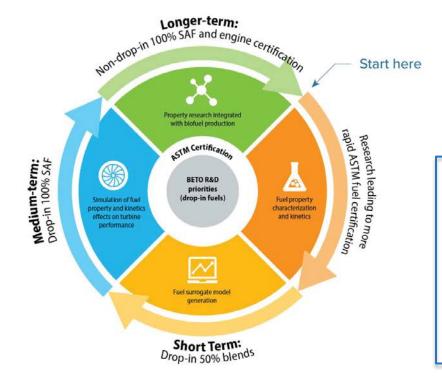
Supporting Decarbonization of Aviation

New ASTM "Fast Track" Approval Process in 2020

<1k gal, <\$1M, <2 years



The SAF technology landscape







Fuel production:



Fuel property characterization: BETO and VTO





Fuel property mapping to turbine performance: VTO



Expanding boundaries of ASTM certification: VTO



De-risking qualification of new fuels (drop-in and marginally drop in): VTO and BETO

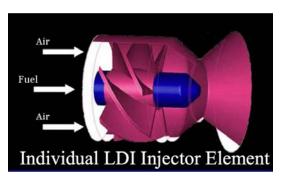


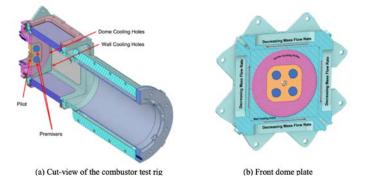
SAF Fuel Effects in Aero Combustors

NASA – Lean Direct Injection (LDI)
7 element configuration

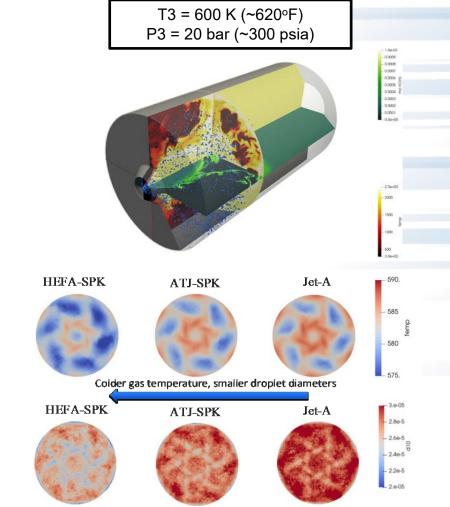
Lean premixed pre-vaporized (LPP) design for commercial supersonic transport (CST)







Combustor concept under development at GE Aviation and Georgia Tech – Funded by FAA



Differences in viscosity and surface tension of HEFA-SPK lead to significant difference vaporization characteristics when compared against Jet-A

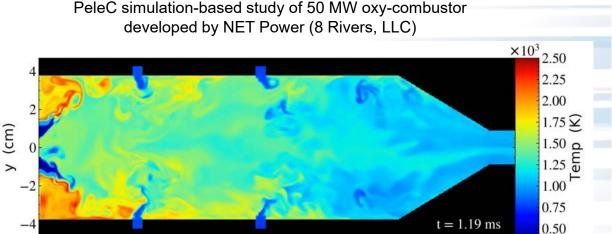


Decarbonization of Power Generation

Oxycombustion concept from NET Power (8 Rivers LLC)

- Allam-Fetvedt Cycle for supercritical CO2
- Almost complete carbon capture
- NG (fuel) + O2 (oxidizer) + CO2 from dilution holes
- CO2 concentration > 0.8 (vs. 0.1 traditional)
- Operating pressure: 300 bar!
- Supercritical conditions require Soave-Redlich-Kwong EOS model (vs. ideal gas)
 - Strong impacts on density models, transport and chemistry

Geometry based on the 50MW demo being run by NET Power since 2019 in Texas. Simulations were performed at part load to help NET Power with combustor design.



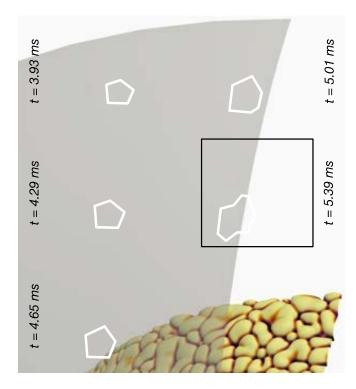
15

10

x (cm)

20

Fundamental and applied research on hydrogen combustion for power generation



PeleLM study of Darrieus-Landau (hydrodynamic) and thermo-diffusive instabilities in hydrogen flames



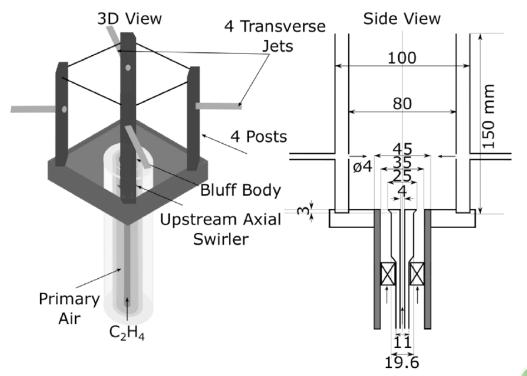
Advanced fuel nozzle simulations using PeleC for high H2-CH4 fuel blends to avoid flashback in stationary gas turbines



High-fidelity Pele simulation of a lab-scale combustor with sustainable aviation fuels (C1 comparison with Jet-A)

Cambridge swirl-stabilized spray flame

- El Helou et al (2023) Fuel https://doi.org/10.1016/j.fuel.2022.125608
- Study soot formation: Jet-A and C5

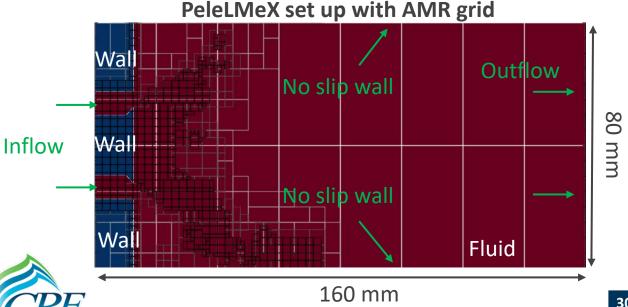


PeleLMeX physical and numerical parameters

- Lagrangian multi-phase spray model
- Embedded boundary treatment
- 4 AMR levels (base + 3 levels): $dx = 78 \mu m$. Number of cells: approx. 350M

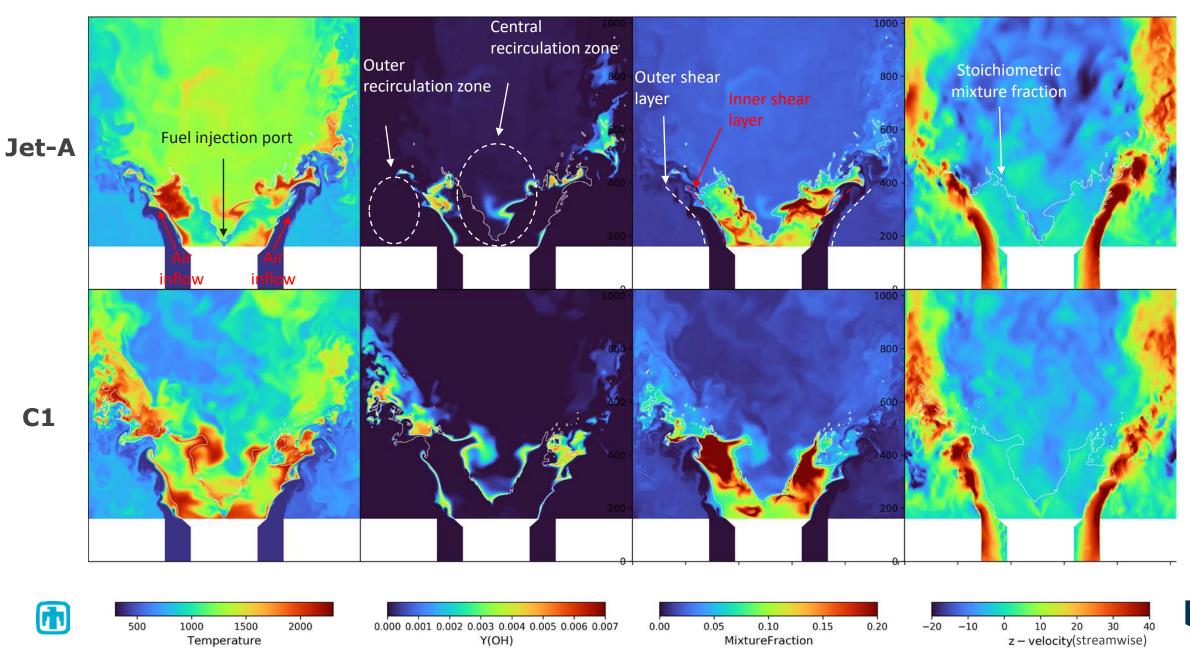
Targeted fuels

- Jet-A: 48-species UIUC mech (Ryu et al. 2021)
- C1: 57-species UIUC mech (Kim et al. 2021)





Instantaneous flame behavior for Jet-A and C1

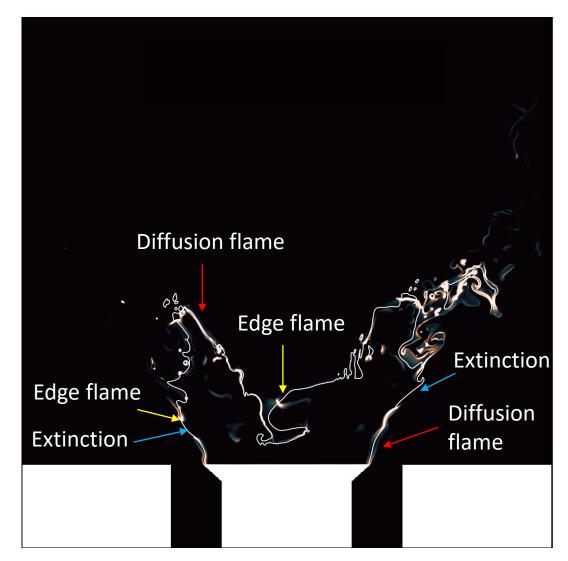


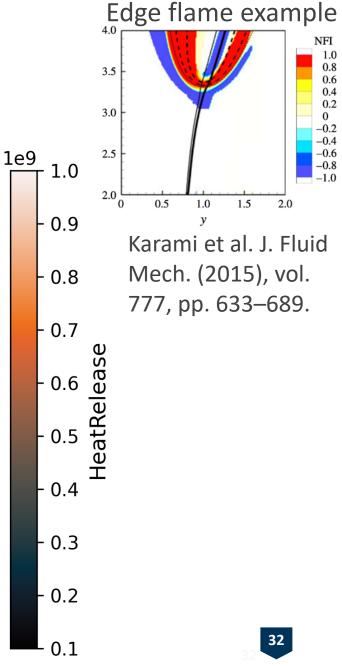
Instantaneous Heat Release Rate for Jet-A

Complex flame behavior

- Diffusion flame
- Local extinction
- Edge flame propagation

Is the edge flame a deflagration front or an ignition front?

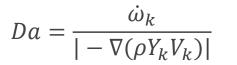






Quantification of ignition/deflagration for Jet-A and C1

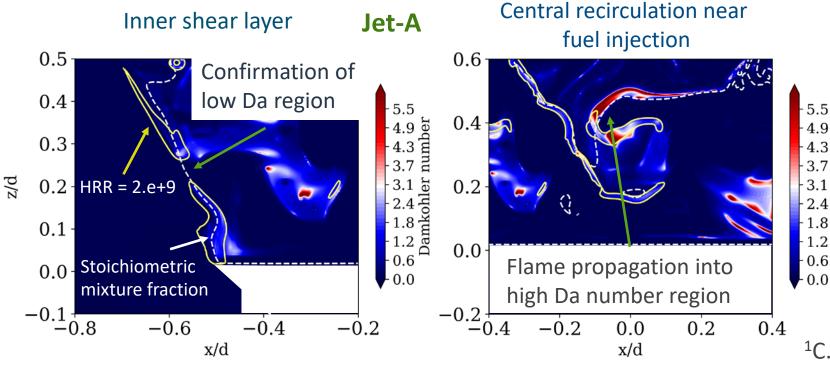
Damköhler number can be used to quantify deflagration fronts

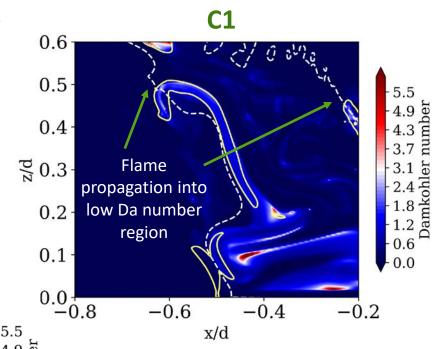


$$Y_C \equiv Y_{CO_2} + Y_{CO}$$

Damköhler number is typically around 3¹

$$Da > 3 =$$
 ignition





- Deflagration and ignition fronts coexist!
- Ignition effects more pronounced for Jet-A

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¹C.S. Yoo et al. PROCI 34 (2013) 2985–2993

Future work

Short-term:

- Cambridge burner with soot predictions and radiation
 - Soot: Hybrid method of moments (HMOM) soot model
 - Focus on soot oxidation
 - Radiation: P1 gray gas model and the Planck-mean spectral model for the gas products and soot

Mid-term:

Simulations at high pressure

Long-term:

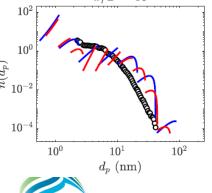
New Approach for soot modeling: Multi-Moment Sectional Method (collaboration with M. Mueller)



¹S. Yang, M.E. Mueller, Proc. Combust. Inst. 37 (2019) 1041-1048 ²H. Maldonado Colmán, M.E. Mueller, 18th International

Conference on Numerical Combustion, 2022

H. Maldonado Colmán, M.E. Mueller, 13th U.S. National Combustion Meeting, 2023

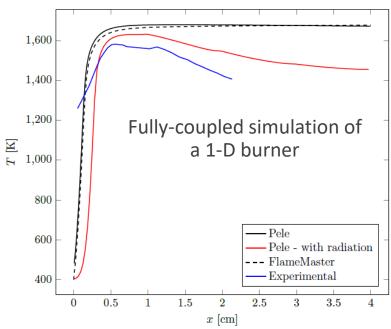


Basic Idea¹: Fewer sections with local polynomial approximation of size distribution within each section

> Converges faster than sectional method

Many fewer degrees-of-freedom required compared to sectional method

Validation of Pele implementation of soot model and radiation

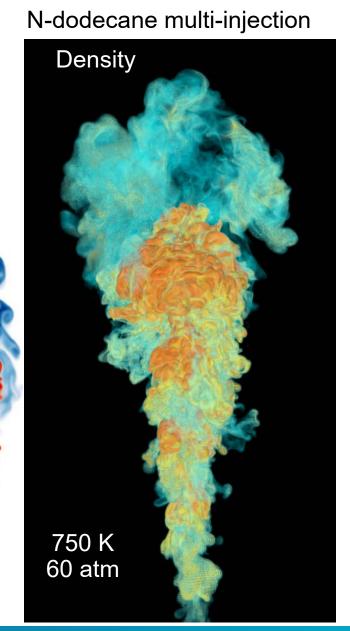


DNS of multi-injection diesel jet flames (PeleLMeX) ndodecane and SAFS

- Simplified gaseous pre-vaporized jets, down-scaled compared to experiment (reduced Re, same Damkohler number)
- Low-Mach jets simulated with PeleLM
- 35 species n-dodecane mechanism with both 1st and 2nd stage ignition chemistry (Borghesi et al., 2018, based on Yao et al., 2017)
- Up to ~3B grid cells, run on Cori
- Simulated two cases at 750 and 900 K oxidizer temperature at 60 atm, 15% O₂ in oxidizer
- Data is used for understanding of physics, and for evaluation and improvement/development of engineering-type models
 - insight into mechanism behind experimental observations of 1st-stage combustion products of first injection affecting ignition of second injection (mixing with high temperature products of first-injection combustion, or mixing with radical species, or flame propagation into penetrating second injection?)

Second Injection

First Injection





Sponsors: DOE Vehicle Technologies Office and DoD Army

Detection of anomalies using AI/ML (Pele – ALPINE – ExaLearn Integration KPP3) for Physics Discovery and steering

- <u>Summary:</u> AI/ML techniques independently developed in ExaLearn are being deployed in-situ with Ascent technology from ALPINE to detect auto-ignition regions in a PeleLM simulation.
- Part of a sustained integration effort through 2023 to explore engine knock
 - KPP-3 goals for ALPINE/ExaLearn, in support of Pele goals:
 - Functionality: in situ anomaly detection as a trigger for further analysis
 - Applications: Turbulent combustion + Higher-order moment tensor analyses
 - Technologies: PeleLM, Ascent, Genten
 - Platform: Summit

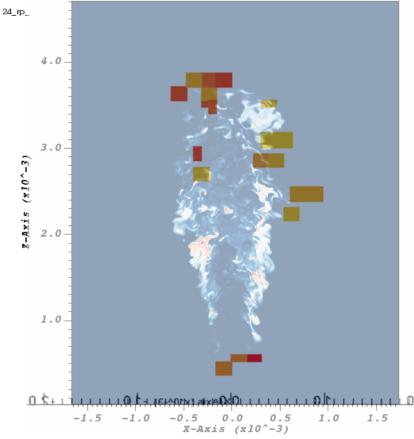
Current Status:

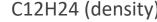
- PeleLM KPP-2 simulation on Frontier (reactivity controlled pulsed ignition of diesel fuel) coupled with Ascent/Genten libraries for in-situ ignition detection.
- Necessary components of PeleLM (boundary conditions, chemistry modules) are GPU-ready.

Long-term Pele goals served by this integration:

- In-situ reduced order modelling for chemistry dimension reduction.
- Targeted DNS training data for constructing PINNs, hybrid ROMs.

Simulation snapshot of an intermediate species overlaid with AMR boxes flagged by the anomaly detection algorithm







Motivation

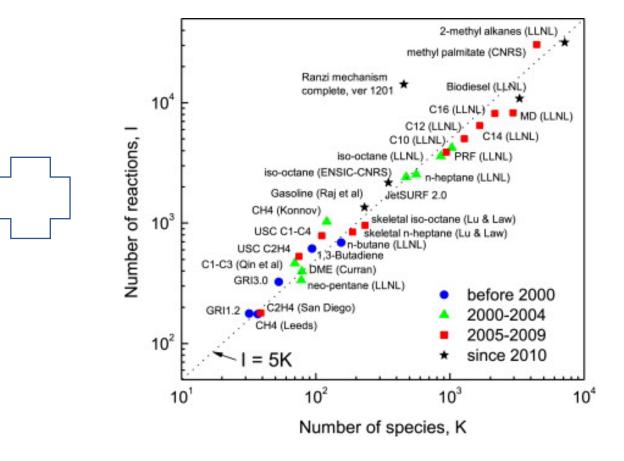
Direct Numerical Simulation (DNS)

Advantages:

Full access to time/space resolved
 3D fields

Disadvantages:

Huge computing and memory requirements

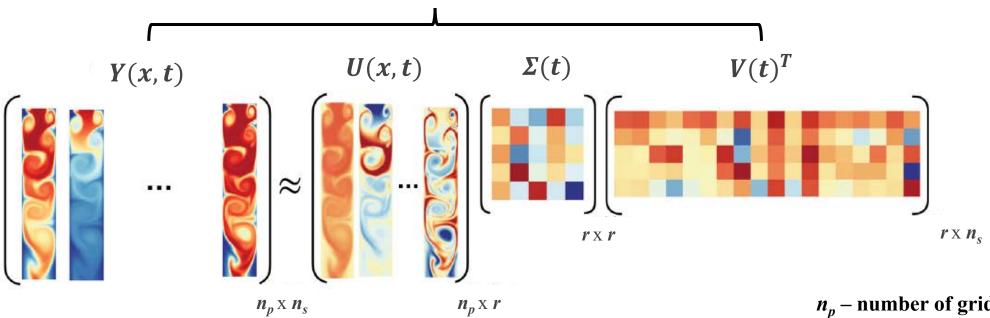


Solutions:

- Use of skeletal / reduced kinetic mechanisms
 - Mechanism size for gasoline / diesel surrogates still upwards of 100 species and 1000 reactions
- Principal component analysis (PCA) based reduced-order modeling (ROM)
 - Need for high fidelity training data
 - Domain expertise (Offline cost)

Dynamical bi-orthonormal (DBO) decomposition-based ROM

Singular Value Decomposition (SVD)



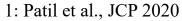
Idea: Obtain on-the-fly low-rank decomposition of species transport equation^{1,2}

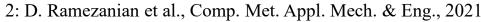
 n_p – number of grid points r – reduction size n_s - number of species ($r \ll n_s$), doesn't include the bath gas

Advantages:

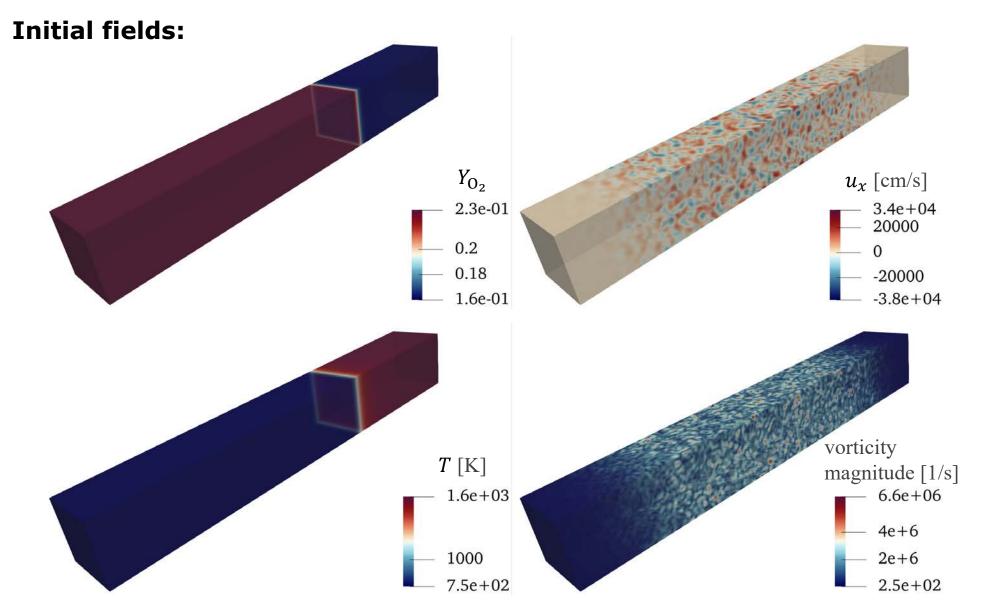
- No need to generate training data
- No need to store the entire species vector
- Potential to scale linearly w.r.t. data size and low-rank-r without requiring to solve large scale optimization problem







Test Case: 3D turbulent flame propagation of a lean premixed hydrogen/air mixture



Initial Condition:

 $\phi = 0.3$ $T_u = 750 \text{ K}$ p = 1 bar $u'/s_l = 21.3$ $l_t/\delta_l = 2.25$ $Re_t = 1,000$ Ka = 300 $L_x \times L_y \times L_z = 1.69 \times 0.226 \times 0.226 \text{ cm}^3$

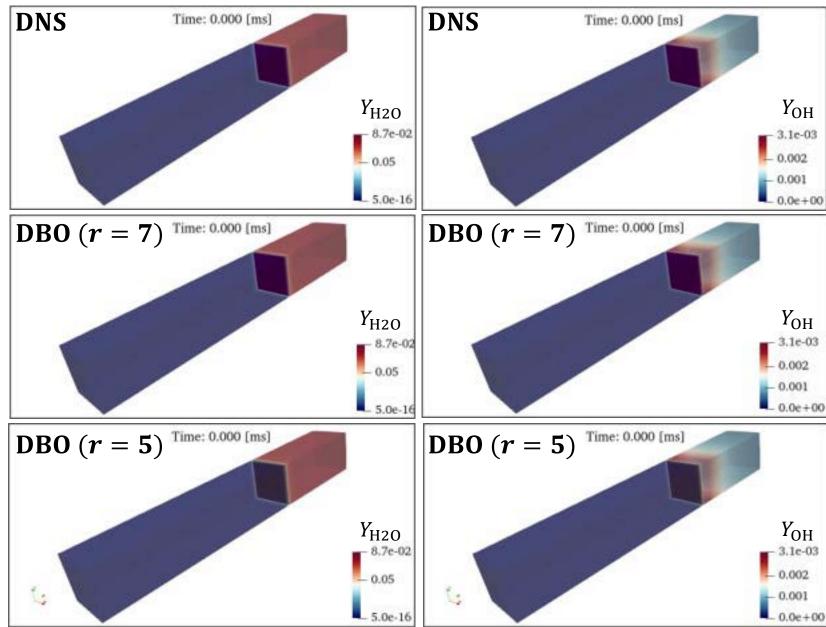
30-micron grid resolution (coarser grid)

9-species detailed H₂/air mechanism

Initialized by 1-D freelypropagating laminar flame

DBO-ROM with r = 5 or 7 started at t = 0

Test Case: 3D turbulent flame propagation of a lean premixed hydrogen/air mixture



The initial laminar flame structure is transitions to a turbulent flame due to the superimposed isotropic turbulence field

The isotropic turbulence dissipates with time \rightarrow flame wrinkling \downarrow with time

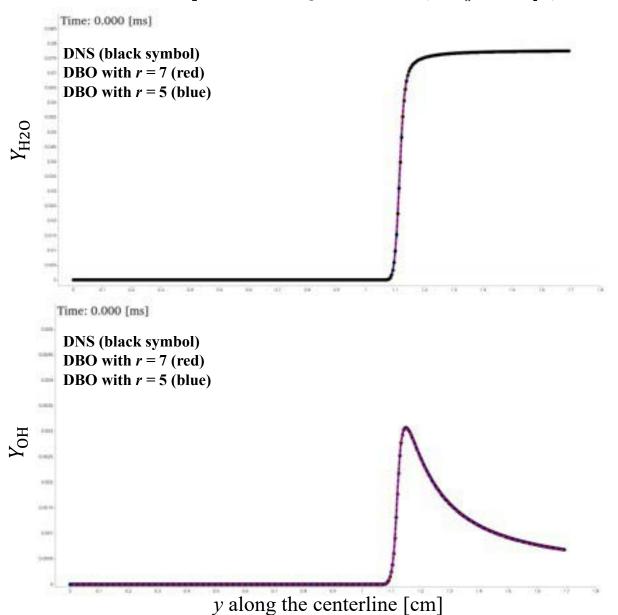
DBO with rank = 7 accurately captures the temporal evolution of major and minor species

DBO with rank = 5 fails to capture the flame propagation characteristics of the hydrogen/air mixture (fuel consumption speed is underestimated)

9-species detailed H_2 /air mechanism is an inherently a high-dimensional system \rightarrow difficult to apply reduced-order modelling

Test Case: 3D turbulent flame propagation of a lean premixed hydrogen/air mixture

Temporal evolution of mass fraction of H₂O and OH along the centerline ($x = L_z/2$, $z = L_z/2$)



The initial laminar flame structure transitions to a turbulent flame due to the superimposed isotropic turbulence field

The isotropic turbulence dissipates with time \rightarrow flame wrinkling \downarrow with time

DBO with rank = 7 accurately captures the temporal evolution of major and minor species

DBO with rank = 5 fails to capture the flame propagation characteristics of the hydrogen/air mixture (consumption speed is underestimated)

9-species detailed H_2 /air mechanism is inherently high-dimensional system \rightarrow difficult to apply reduced-order modelling



Thank you!

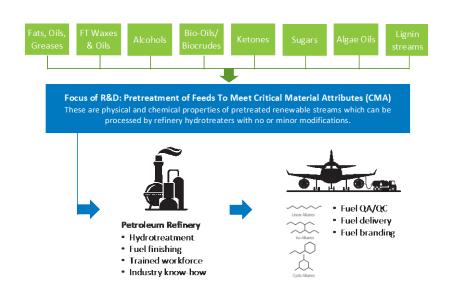
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NREL/PR-2C00-85968

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NREL Bio-Fuel Property Measurement









NanoScience Surface Tension





Soon to be commissioned:

Viscosity at 68 bar and -40°C to 315°C
Density at 500 bar and -10°C to 110°C
Surface Tension at 68 atm and -35°C to 450°C
Ignition delay with AFIDA
Pressure-enthalpy diagram by DSC



