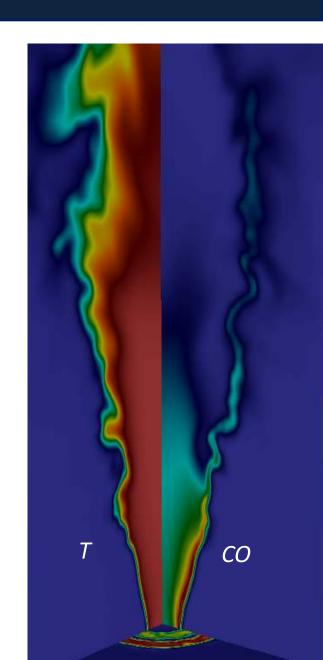
# LES/PDF Modeling of Turbulent Reacting Flows

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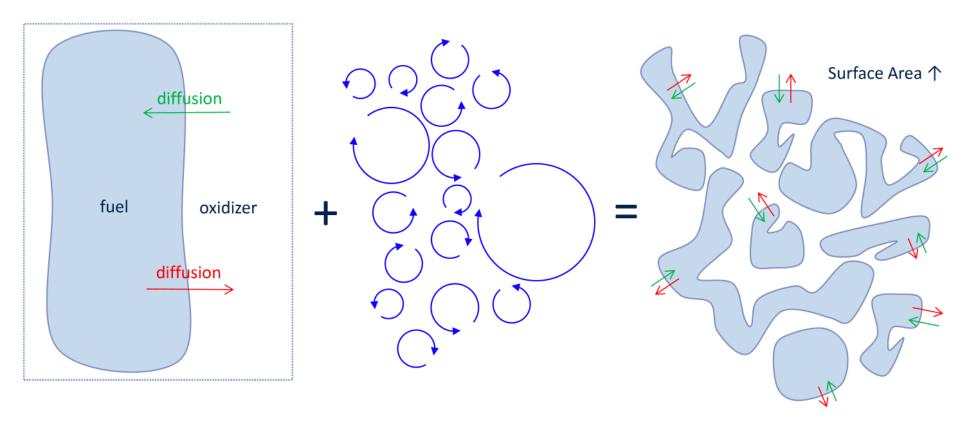




# Outline

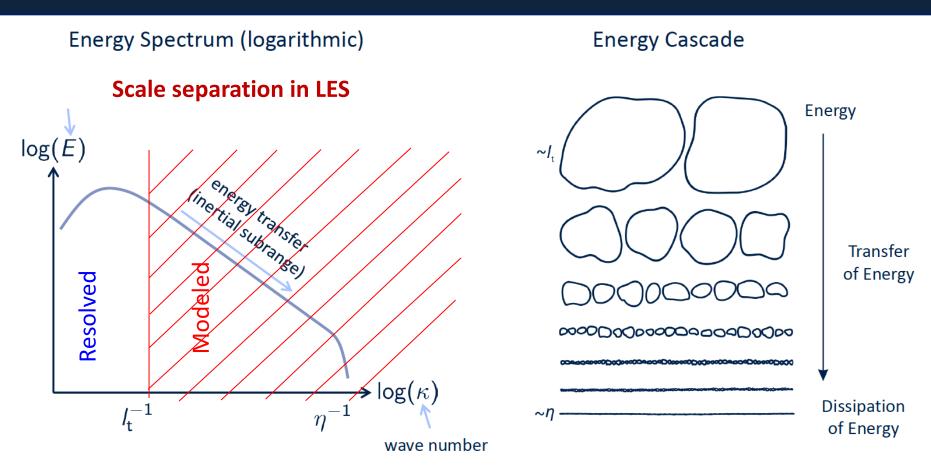
- Motivations
- LES/PDF Method
- Numerical Solution Algorithm
- Cambridge/Sandia Stratified Flames
  - Non-swirling flames
  - Swirling flames
- Results and Comparison with Experimental Data
- Conclusions

### Why turbulent combustion?



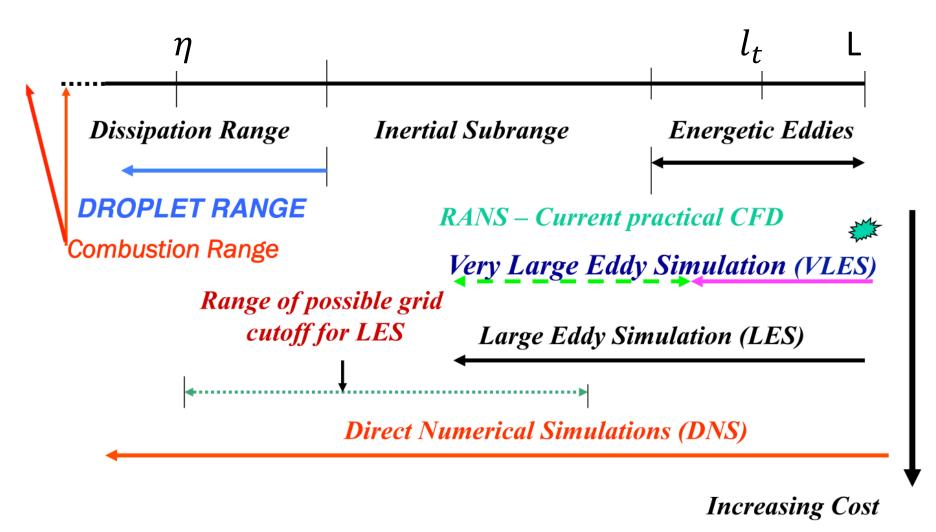
- Combustion requires mixing at the molecular level
- Turbulence: enhanced convective transport + molecular mixing

### Why LES?



- The energy cascade and Kolmogorov's hypotheses:
  - Energy is extracted from large scale and cascaded to smaller scales until its dissipation
  - The small scale motion is ``universal"
- In LES: Resolve the large scale motion and model the ``universal" small scale motion
  - Modelling is still an issue but it is theoretically possible to develop a flow-independent model

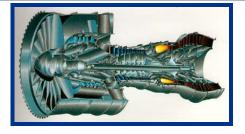
### Modeling of Turbulent Reacting Flows

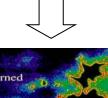


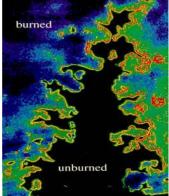
For LES: Resolve at least 80% of turbulent kinetic energy (Pope 2004)

# Scale Separation in Combustion?

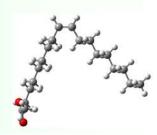
- Typical range of spatial scales
  - Scale of combustor: 10 100 cm
  - Energy containing eddies: 1 10 cm
  - Small-scale mixing of eddies: 0.1 10 mm
  - Diffusive-scales, flame thickness: 10 100 μm
  - Molecular interactions, chemical reactions: 1 10 nm
- Spatial and temporal dynamics inherently coupled
- All scales are relevant and must be resolved or modeled
- In particular, chemical reactions occur at molecular scale
- So, LES has the same closure problem as RANS



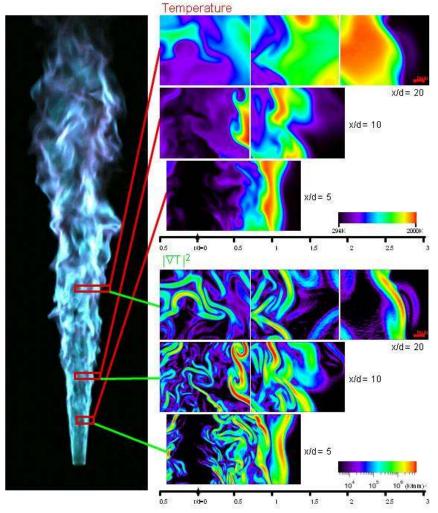








# Grand Challenges in Combustion



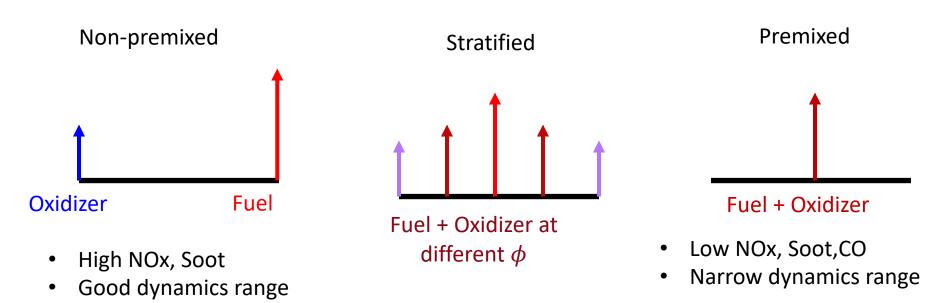
https://crf.sandia.gov/combustion-research-facility/reacting-flow/flow-experiments/imaging/

- **Stiffness** : wide range of length and time scales
  - combustor (cm)
  - turbulence-chemistry (mm)
  - flame reaction zone (µm)
  - soot inception (nanometer)
- Chemical complexity

   large number of species and reactions
   (100's of species, thousands of reactions)
- Multi-physics complexity
  - multiphase (liquid spray, gas phase, soot, surface)
  - thermal radiation
  - acoustics ...
  - All of these are tightly coupled

S.B. Pope, ``Small scales, many species and the manifold challenges of turbulent combustion", Proc. Combust. Inst., 34(1):1-31 (2013)

# **Modes of Combustion**



#### Combustion usually takes place in a stratified mode in gas turbine combustors:

- The limited time and length scales imposed by design constraints that prevent fuel from mixing with oxidizer (unintentional).
- The stratification is created to increase the flame stability for lean combustion (intentional).
- A rich burn/quench/lean burn (RQL) combustion is common in many aero engines (intentional).
- **PDF method is well suited**: No inherent assumption on the type of combustion

### **Reacting Flows: Mathematical Model**

• The mass conservation:

$$\frac{\partial \rho}{\partial t} + \frac{\partial \rho u_j}{\partial x_j} = 0$$

• The momentum conservation:

$$\frac{\partial \rho u_i}{\partial t} + \frac{\partial \rho u_i u_j}{\partial x_j} = -\frac{\partial p}{\partial x_i} + \frac{\partial \tau_{ij}}{\partial x_j} + \rho g_i; \qquad \tau_{ij} = \mu \left(\frac{\partial u_i}{\partial x_j} + \frac{\partial u_j}{\partial x_i}\right) - \frac{2}{3} \mu \frac{\partial u_k}{\partial x_k} \delta_{ij}$$

• The energy and species mass conservation (n<sub>s</sub> species involved):

$$\frac{\partial \rho \phi_{\alpha}}{\partial t} + \frac{\partial \rho u_{j} \phi_{\alpha}}{\partial x_{j}} = \frac{\partial}{\partial x_{j}} \left( \rho D_{\alpha} \frac{\partial \phi_{\alpha}}{\partial x_{j}} \right) + \rho S_{\alpha}$$
$$\boldsymbol{\phi} = \left[ \phi_{1}, \phi_{2}, \phi_{3}, \dots, \phi_{n_{s}}, h \right]$$

• The equation of state:

 $p = \rho RT$ 

 $S_{\alpha} = S_{\alpha}(\boldsymbol{\phi}, x, t)$ Highly non-linear function of mass fractions and temperature (enthalpy)

### The Filtering Operation in LES

• The definition of low-pass filter:

$$\bar{\rho}(\mathbf{x}) \equiv \int_{-\infty}^{\infty} \rho(\mathbf{y}, t) \, G(\mathbf{y} - \mathbf{x}) d\mathbf{y}$$

$$\tilde{Q}(\boldsymbol{x}) \equiv \frac{1}{\overline{\rho}(\boldsymbol{x})} \int_{-\infty}^{\infty} \rho(\boldsymbol{y}, t) Q(\boldsymbol{y}, t) G(\boldsymbol{y} - \boldsymbol{x}) d\boldsymbol{y}$$

• The filtered equations and closure problem:

$$\begin{split} \frac{\partial \overline{\rho}}{\partial t} &+ \frac{\partial \overline{\rho} \widetilde{u}_{j}}{\partial x_{j}} = 0, \\ \frac{\partial \overline{\rho} \widetilde{u}_{i}}{\partial t} &+ \frac{\partial \overline{\rho} \widetilde{u}_{i} \widetilde{u}_{j}}{\partial x_{j}} = -\frac{\partial \overline{p}}{\partial x_{i}} + \frac{\partial \widetilde{\tau}_{ij}}{\partial x_{j}} + \frac{\partial T_{ij}}{\partial x_{j}}, \\ \widetilde{\tau}_{ij} &\approx \widetilde{\mu} \left( \frac{\partial \widetilde{u}_{i}}{\partial x_{j}} + \frac{\partial \widetilde{u}_{j}}{\partial x_{i}} \right) - \frac{2}{3} \mu \frac{\partial \widetilde{u}_{k}}{\partial x_{k}} \delta_{ij}; \qquad T_{ij} = \overline{\rho} \widetilde{u}_{i} \widetilde{u}_{j} - \overline{\rho} \widetilde{u}_{i} \widetilde{u}_{j} \\ \frac{\partial \overline{\rho} \widetilde{\phi}_{\alpha}}{\partial t} + \frac{\partial \overline{\rho} \widetilde{u}_{j} \widetilde{\phi}_{\alpha}}{\partial x_{j}} = \frac{\partial}{\partial x_{j}} \left( \overline{\rho} \widetilde{D}_{\alpha} \frac{\partial \widetilde{\phi}_{\alpha}}{\partial x_{j}} \right) + \frac{\partial T_{\alpha j}}{\partial x_{j}} + \overline{\rho} \widetilde{S}_{\alpha}; \qquad T_{\alpha j} = \overline{\rho} \widetilde{\phi}_{\alpha} \widetilde{u}_{j} - \overline{\rho} \widetilde{\phi}_{\alpha} \widetilde{u}_{j} \end{split}$$

- Observe that
  - $\tilde{S}_{\alpha} \neq S\big(\widetilde{\boldsymbol{\phi}}\big)$
- Main task in combustion is to model the source term!

## The LES/PDF Approach

• The filtered mass density function:

$$\mathcal{F}(\boldsymbol{\psi};\boldsymbol{x},t) \equiv \int_{-\infty}^{\infty} \rho(\boldsymbol{y},t) \,\delta\big(\boldsymbol{\psi} - \boldsymbol{\phi}(\boldsymbol{y},t)\big) G(\boldsymbol{y} - \boldsymbol{x}) d\boldsymbol{y}$$

• The Favre-filtered PDF:

$$\tilde{f} \equiv \mathcal{F}(\boldsymbol{\psi}; \boldsymbol{x}, t) / \bar{\rho}; \qquad \tilde{Q}(\boldsymbol{x}, t) = \int Q(\boldsymbol{\psi}; \boldsymbol{x}, t) \, \tilde{f}(\boldsymbol{\psi}; \boldsymbol{x}, t) \, \mathrm{d}\boldsymbol{\psi}$$

• The exact transport equation for the joint PDF of compositions:

$$\frac{\partial \bar{\rho}\tilde{f}}{\partial t} + \frac{\partial \bar{\rho}\tilde{u}_{i}\tilde{f}}{\partial x_{i}} - \frac{\partial}{\partial x_{i}} \left( \bar{\rho} \left( \widetilde{u_{i}^{\prime\prime} | \boldsymbol{\psi}} \right) \tilde{f} \right) = \frac{\partial}{\partial \psi_{\alpha}} \left[ \tilde{f} \left( -\frac{\overline{\partial J_{i}^{\alpha}}}{\partial x_{i}} | \boldsymbol{\psi} \right) \right] + \frac{\partial}{\partial \psi_{\alpha}} \left( \bar{\rho}\tilde{f}S_{\alpha}(\boldsymbol{\psi}) \right)$$
$$J_{i}^{\alpha} = -\rho D_{\alpha} \frac{\partial \phi_{\alpha}}{\partial x_{i}}; \quad u_{i}^{\prime\prime} = u_{i} - \tilde{u}_{i}$$

- The chemical source term is in the closed form
- Arbitrarily non-linear chemical reactions are treated exactly in the PDF methods
- This is the main advantage of the PDF methods

# Modeling the Unclosed Terms

• The gradient diffusion assumption:

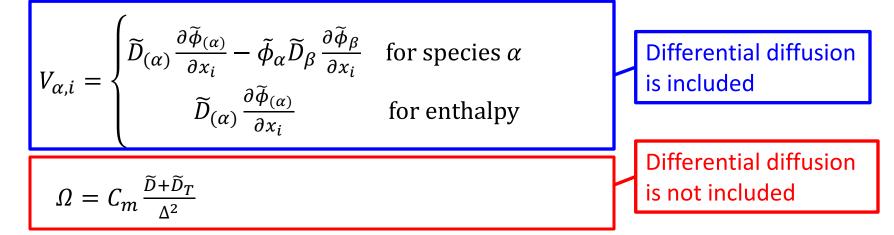
 $(u_i^{\prime\prime}|\boldsymbol{\psi})\tilde{f} = -\widetilde{D}_T \frac{\partial \tilde{f}}{\partial x_i}$ 

• The Favre-filtered PDF:

$$\left(-\frac{\overline{\partial J_i^{\alpha}}}{\partial x_i}|\boldsymbol{\psi}\right) = \frac{1}{\overline{\rho}}\frac{\overline{\partial}}{\partial x_i}\left(\rho D_{\alpha}\frac{\partial \phi_{\alpha}}{\partial x_i}\right)|\boldsymbol{\psi} = -\Omega\left(\psi_{\alpha} - \tilde{\phi}_{\alpha}\right) + \frac{1}{\overline{\rho}}\frac{\partial}{\partial x_i}\left(\overline{\rho}\widetilde{D}_{\alpha}\frac{\partial \tilde{\phi}_{\alpha}}{\partial x_i} - \overline{\rho}\tilde{\phi}_{\alpha}V_c\right)$$

The modeled transport equation for the joint PDF of composition:

$$\frac{\partial \bar{\rho} \tilde{f}}{\partial t} + \frac{\partial \bar{\rho} \tilde{u}_i \tilde{f}}{\partial x_i} - \frac{\partial}{\partial x_i} \left( \bar{\rho} \tilde{D}_T \frac{\partial \tilde{f}}{\partial x_i} \right)$$
$$= \frac{\partial}{\partial \psi_{\alpha}} \left[ \bar{\rho} \tilde{f} \Omega (\psi_{\alpha} - \tilde{\phi}_{\alpha}) \right] - \frac{\partial}{\partial \psi_{\alpha}} \left[ \tilde{f} \frac{\partial}{\partial x_i} (\bar{\rho} V_{\alpha,i}) \right] - \frac{\partial}{\partial \psi_{\alpha}} \left( \bar{\rho} \tilde{f} S_{\alpha}(\boldsymbol{\psi}) \right)$$



# A Numerical Challenge

• The modeled transport equation for the joint PDF of composition:

$$\frac{\partial \bar{\rho} \tilde{f}}{\partial t} + \frac{\partial \bar{\rho} \tilde{u}_{i} \tilde{f}}{\partial x_{i}} - \frac{\partial}{\partial x_{i}} \left( \bar{\rho} \, \tilde{D}_{T} \frac{\partial \tilde{f}}{\partial x_{i}} \right)$$

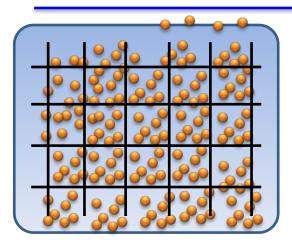
$$= \frac{\partial}{\partial \psi_{\alpha}} \left[ \bar{\rho} \, \tilde{f} \, \Omega(\psi_{\alpha} - \tilde{\phi}_{\alpha}) \right] - \frac{\partial}{\partial \psi_{\alpha}} \left[ \tilde{f} \, \frac{\partial}{\partial x_{i}} (\bar{\rho} \, V_{\alpha,i}) \right] - \frac{\partial}{\partial \psi_{\alpha}} \left( \bar{\rho} \tilde{f} S_{\alpha}(\boldsymbol{\psi}) \right)$$

- The modeled the joint PDF evolves in a high (i.e.,  $n_s + 4$ ) dimensional space
  - $n_s = 16$  for a simple CH4/Air combustion with a reduced ARM1 mechanism
  - $n_s = O(100)$  for a simple Diesel combustion
- Conventional numerical methods (FDM,FVM,FEM, etc.) cannot be used to solve the PDF transport equation
- The remaining alternative is the Monte Carlo method
- Particle-based Lagrangian Monte Carlo method has proved to be a highly effective and viable method (Pope, 1994)
  - Construct an equivalent system of stochastic differential equations.

## The Equivalent System

• The modeled transport equation for the joint PDF of composition:

$$\frac{\partial \bar{\rho} \tilde{f}}{\partial t} + \frac{\partial \bar{\rho} \tilde{u}_i \tilde{f}}{\partial x_i} - \frac{\partial}{\partial x_i} \left( \bar{\rho} \, \tilde{D}_T \, \frac{\partial \tilde{f}}{\partial x_i} \right) \\ = \frac{\partial}{\partial \psi_\alpha} \left[ \bar{\rho} \, \tilde{f} \, \Omega(\psi_\alpha - \tilde{\phi}_\alpha) \right] - \frac{\partial}{\partial \psi_\alpha} \left[ \tilde{f} \, \frac{\partial}{\partial x_i} (\bar{\rho} \, V_{\alpha,i}) \right] - \frac{\partial}{\partial \psi_\alpha} \left( \bar{\rho} \tilde{f} S_\alpha(\boldsymbol{\psi}) \right)$$



$$dX_{i} = \left[\tilde{u}_{i} + \frac{1}{\bar{\rho}}\frac{\partial\bar{\rho}\tilde{D}_{T}}{\partial x_{i}}\right]dt + \sqrt{2\tilde{D}_{T}}dW_{i}$$
$$d\phi_{\alpha} = -\Omega(\phi_{\alpha} - \tilde{\phi}_{\alpha})dt + \left(\frac{1}{\bar{\rho}}\frac{\partial\bar{\rho}V_{\alpha,j}}{\partial x_{j}}\right)dt + S_{\alpha}(\boldsymbol{\phi})dt$$

The flow is represented by a set of Lagrangian particles.

The SDEs exhibit the same joint PDF as that given by the PDF transport equation, i.e., they are equivalent.

### The Hybrid Lagrangian/Eulerian Algorithm

• The LES system solved by a FV method:

$$\frac{\partial \bar{\rho}}{\partial t} + \frac{\partial \bar{\rho} \tilde{u}_i}{\partial x_i} = 0$$
$$\frac{\partial \bar{\rho} \tilde{u}_i}{\partial t} + \frac{\partial \bar{\rho} \tilde{u}_i \tilde{u}_j}{\partial x_j} = -\frac{\partial \bar{p}}{\partial x_i} + \frac{\partial \tau_{ij}}{\partial x_j} + \frac{\partial T_{ij}}{\partial x_j}$$

Where

$$\tau_{ij} = \tilde{\mu} \left( \frac{\partial \tilde{u}_i}{\partial x_j} + \frac{\partial \tilde{u}_j}{\partial x_i} - \frac{2}{3} \frac{\partial \tilde{u}_k}{\partial x_k} \delta_{ij} \right); \quad T_{ij} = \bar{\rho} \tilde{u}_i \tilde{u}_j - \bar{\rho} \tilde{u}_i \tilde{u}_j$$

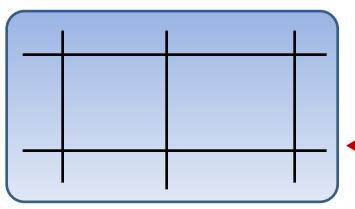
The residual stresses  $(T_{ij})$  are modeled by dynamic Smagorinsky model of Moin et al. (1991) with Lagrangian averaging method of Meneveau et al. (1996)

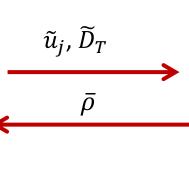
• The PDF system solved by a Lagrangian Monte Carlo method:

$$dX_{i} = \left[\tilde{u}_{i} + \frac{1}{\bar{\rho}}\frac{\partial\bar{\rho}\tilde{D}_{T}}{\partial x_{i}}\right]dt + \sqrt{2\tilde{D}_{T}}dW_{i}$$
$$d\phi_{\alpha} = -\Omega\left(\phi_{\alpha} - \tilde{\phi}_{\alpha}\right)dt + \left(\frac{1}{\bar{\rho}}\frac{\partial\bar{\rho}V_{\alpha,j}}{\partial x_{j}}\right)dt + S_{\alpha}(\boldsymbol{\phi})dt$$

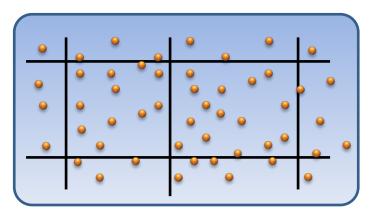
# The Numerical Method (Turkeri et al. CTM, 2019)

#### Finite Volume Method

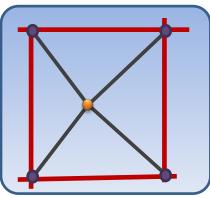




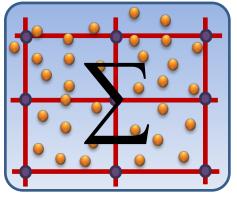
#### Lagrangian Monte Carlo Method



#### Interpolation



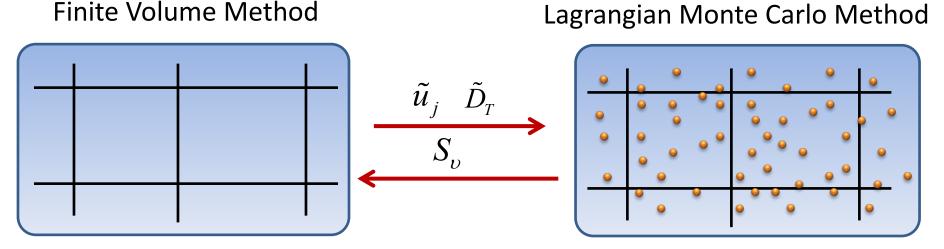
#### **Mean Estimation**



- The LES equations are solved using a FV method (pimpleFoam)
- The PDF equations are solved using a Lagrangian Monte Carlo method
- The chemical kinetic equations are solved using ISAT

All done in **OpenFAOM** 

# The Density Coupling (Popov et al. JCP, 2015)

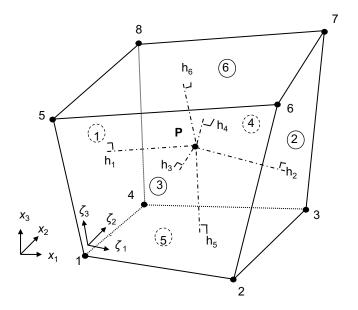


- Using the noisy particle density field in LES causes numerical difficulty
- Instead we ``smooth" the density by solving an equation for specific volume (Popov et al. 2015)

 $\bar{\rho}\frac{\partial\hat{v}}{\partial t} + \bar{\rho}\frac{\partial\tilde{u}_{j}\hat{v}}{\partial x_{j}} = \bar{\rho}\frac{\partial}{\partial x_{j}}\left(\tilde{D}_{T}\frac{\partial\hat{v}}{\partial x_{j}}\right) + S_{v} + \bar{\rho}\frac{\tilde{v}_{PDF} - \hat{v}}{\tau_{v}}$  $\bar{\rho} = \frac{1}{\hat{v}}$  rate of volume  $\tau_{v} = 4\Delta t$ 

### The Mean Estimation and Interpolation

Define logical coordinates and basis functions:\*



$$\begin{split} \zeta_1 &= \frac{h_1}{h_1 + h_2}, \quad \zeta_2 = \frac{h_3}{h_3 + h_4}, \quad \zeta_3 = \frac{h_5}{h_5 + h_6} \\ b_1 &= (1 - \zeta_1)(1 - \zeta_2)(1 - \zeta_3), \quad b_2 = \zeta_1(1 - \zeta_2)(1 - \zeta_3), \\ b_3 &= \zeta_1 \zeta_2(1 - \zeta_3), \quad b_4 = (1 - \zeta_1)\zeta_2(1 - \zeta_3), \\ b_5 &= (1 - \zeta_1)(1 - \zeta_2)\zeta_3, \quad b_6 = \zeta_1(1 - \zeta_2)\zeta_3, \\ b_7 &= \zeta_1 \zeta_2 \zeta_3, \quad b_8 = (1 - \zeta_1)\zeta_2 \zeta_3, \end{split}$$

Mean Estimation\*

$$\tilde{\phi}_{(j)} = \frac{\sum_{k \in C_j} \sum_{i=1}^{N^{[k]}} \omega^{(i)} \phi^{(i)} b_{\alpha} \left( \zeta^{(i)} \right)}{\sum_{k \in C_j} \sum_{i=1}^{N^{[k]}} \omega^{(i)} b_{\alpha} \left( \zeta^{(i)} \right)}$$

Interpolation onto particle locations\*

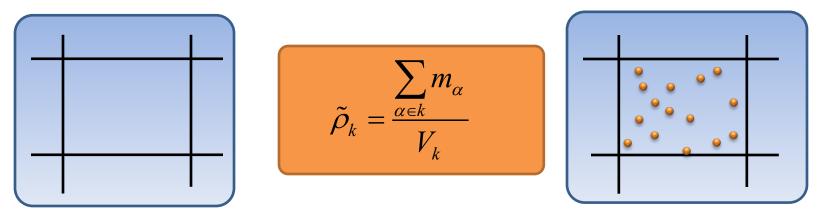
$$ilde{\phi}^{(i)} = \sum_lpha ilde{\phi}_{(j)} b_lpha \left( \zeta^{(i)} 
ight)$$

\*Zhang and Haworth, JCP (2004).

### The Consistency Condition\*

#### **Finite Volume Method**

#### **Monte Carlo Method**



- The density in the FV-LES solver should be equal to the particle mass density in the PDF solver
- This condition should be satisfied throughout the simulations
- A three-stage velocity correction algorithm is employed to enforce the condition

\*Muradoglu et al. JCP (2001)

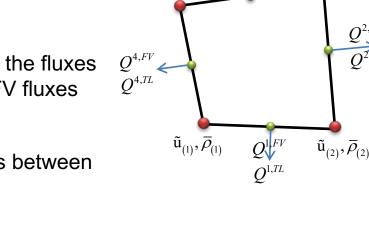
# The Velocity Correction\*

The Three-Stage Velocity Correction Method\*

- The first stage:
  - Linear interpolation from cell centers to cell vertices
- The second stage:
  - A linear system of equations is solved to make the fluxes implied by linear interpolation consistent with FV fluxes
- The third stage: The post correction
  - An equation is solved to eliminate the residuals between FV mass and particles mass

$$R^k \equiv rac{m^{k,FV}-m^{k,p}}{ au_{s3}}$$
 where  $au_{s3=k\Delta t}$ 

- A pressure-Poisson like equation is solved
- A relaxation is applied to avoid extreme corrections
- Not usually required



 $\tilde{u}_{(4)}, \bar{\rho}_{(4)}$ 

 $\tilde{u}_{(3)}, \overline{\rho}_{(3)}$ 

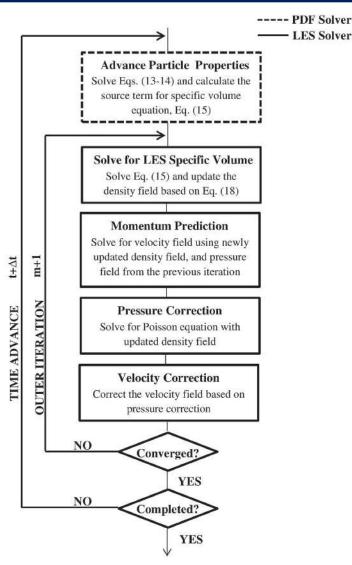
\*Zhang and Haworth, JCP (2004) and Turkeri et al. CTM (2019).

### Heat Loss Through Walls

Heat loss through the wall is accounted for through the modification of the mean fields:

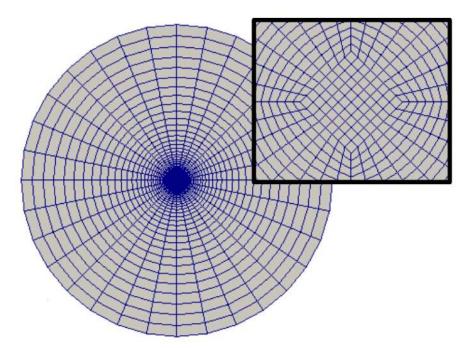
$$d\phi_{\alpha}(t) = -\Omega\left(\phi_{\alpha} - \tilde{\phi}_{\alpha}\right)dt + \left(\frac{1}{\bar{\rho}}\frac{\partial}{\partial x_{j}}\left(\bar{\rho}\tilde{D}_{(\alpha)}\frac{\partial}{\partial x_{j}}\right)dt + S_{\alpha}(\phi)dt$$

## **Overall Solution Algorithm\***



The flow chart of the LES/PDF solver.

\*Turkeri et al. CTM (2019).

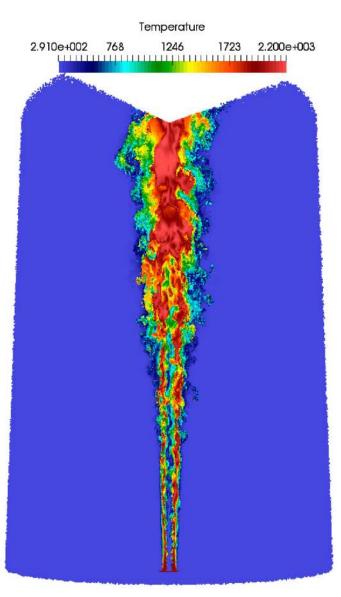


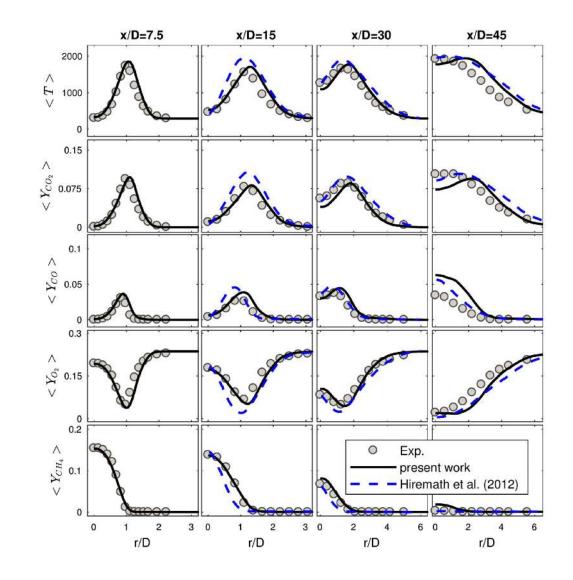
The block-structured grid used in the simulations.

- The present simulations have been performed using block-structured grids
- But the fully unstructured grids can be used in complex geometries
- Can be applied to realistic geometries including industry scale combustors

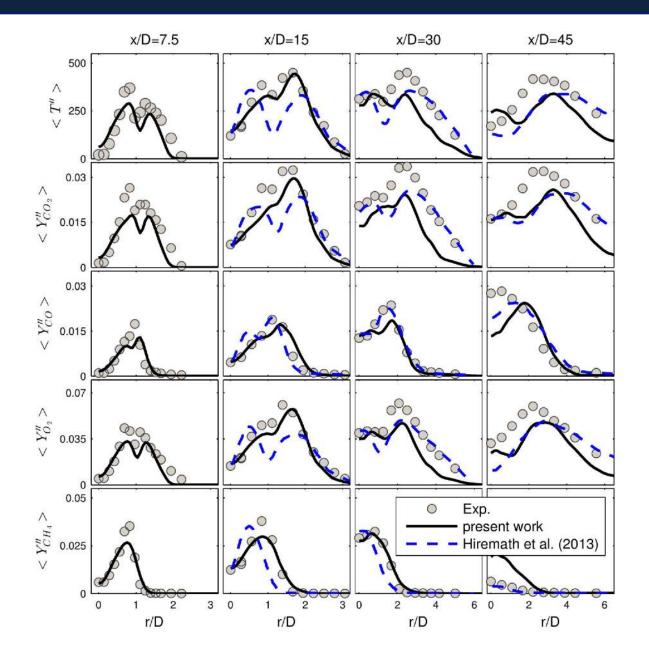
### Validation: Sandia Flame-D

#### Test case: Sandia Flame D with flamelet





#### Validation: Sandia Flame-D



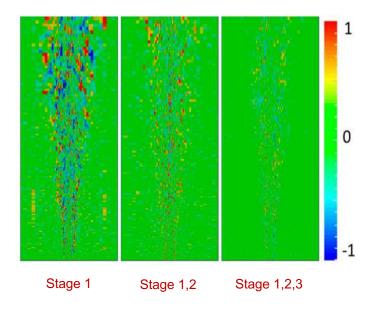
# Performance of Velocity Correction Algorithm

#### Test case: Sandia Flame D with flamelet

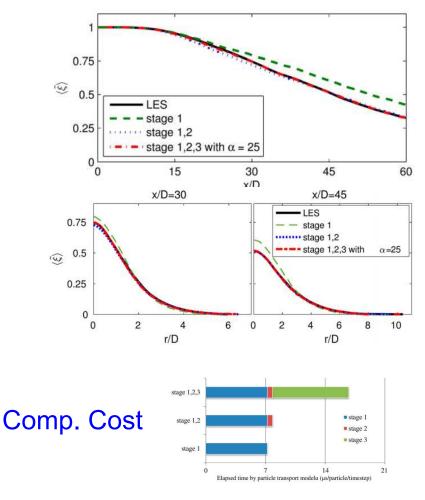
Consistent transport equations are solved by both

- FV method in LES solver
- Monte Carlo method in PDF solver

 $R^{k} \equiv \frac{m^{k,FV} - m^{k,p}}{\tau_{s3}}$  where  $\tau_{s3=k\Delta t}$ 



#### **Mean Mixture Fraction**



# Applications: The Cambridge/Sandia Flames\*



SwB7

Swirling

SwB2

SwB6

Operating conditions for Cambridge Stratified Swirl Burner. In all cases  $\phi_g = 0.75$ ,  $U_i = 8.31 \text{ m/s}$ , and  $U_{co-flow} = 0.4 \text{ m/s}$ . Swirling flows are highlighted in bold font.

Flame	SFR	S	η(°)	$\phi_{\rm o}/\phi_{\rm i}$	$\phi_{\mathrm{i}}$	$\phi_{\mathrm{o}}$
SwB1	0	0	0	1	0.75	0.75
SwB2	0.25	0.45	24.4	1	0.75	0.75
SwB3	0.33	0.79	38.5	1	0.75	0.75
SwB5	0	0	0	2	1.0	0.5
SwB6	0.25	0.45	24.4	2	1.0	0.5
SwB7	0.33	0.79	38.5	2	1.0	0.5
SwB9	0	0	0	3	1.125	0.375
SwB10	0.25	0.45	24.4	3	1.125	0.375
SwB11	0.33	0.79	38.5	3	1.125	0.375

\*Sweeney et al. CNF, 159 (2012)



# Cambridge-Sandia Stratified Non-Swirling Flames

H. Turkeri, X. Zhao, S.B. Pope and M. Muradoglu

"Large eddy simulation/probability density function simulations of the Cambridge turbulent stratified flame series", *Combustion and Flame*, 199:24-45 (2019).

# Cambridge Stratified Flame Series: Non-Swirling

# Designed to investigate the effects of stratification under non-swirling conditions [1,2,3]

Inlet	Bulk velocity [m/s]	Reynolds number	
inner	8.31	5960	
outer	18.7	11500	<b>(</b>
coflow	0.4	-	

	Ø <sub>i</sub>	Ø。	Ø <sub>i</sub> /Ø <sub>o</sub>
SwB1	0.75	0.75	1
SwB5	1	0.5	2
SwB9	1.125	0.375	3

	air coflow	
	outer jet	
	inner jet	$\mathbf{N}$
	bluff body	))
	12.7 mm 23.6 mm	
🖣	25.4 mm	→
	34.8 mm 38.1 mm	

	Computational Details
Domain	200mm x 200mm x 2π
Mesh	2.3 millioncells
Time step	2x 10 <sup>-6</sup> s
PDF Particles	20 per cell
Cost	380 µs/cell/core/time step

[1] - Sweeney et al.,	, Combust.	Flame,	2012.
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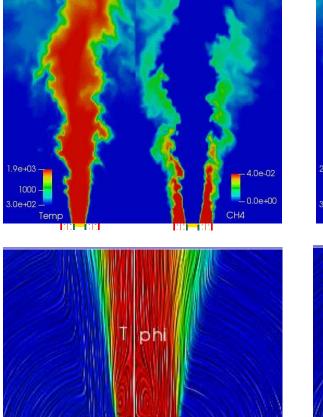
- [2] Sweeney et al., Combust. Flame, 2012.
- [3] Zhou et al., Combust. Flame, 2012.

Model variations for parametric studies.	Model	variations	for	parametric	studies.
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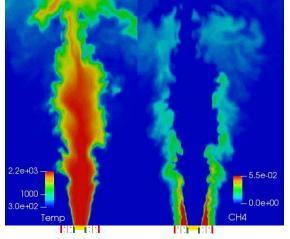
Model	Cm mixing coefficient	Differential diffusion	SwB1	SwB5	SwB9
DD25	25	1	1	2	1
<b>DD50</b>	50	~	×	1	×
ED25	25	×	1	$\checkmark$	~

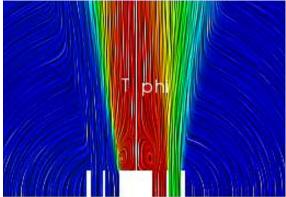
#### Cambridge Stratified Flames: Non-swirling cases

Premixed Flame (SwB1)

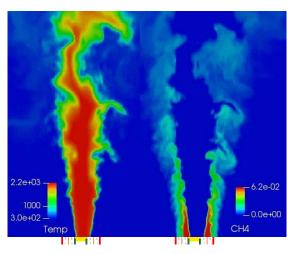


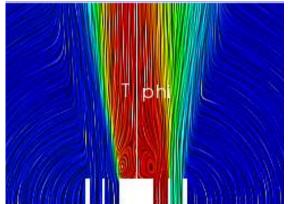
#### Moderately Stratified Flame (SwB5)





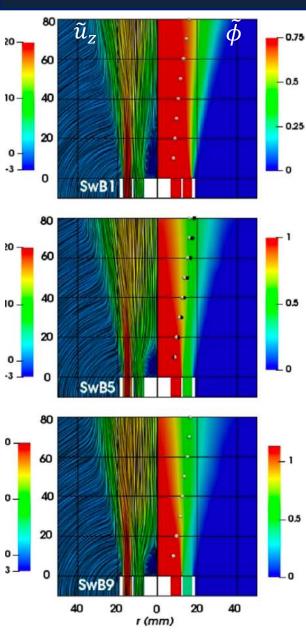
#### Highly Stratified Flame (SwB9)

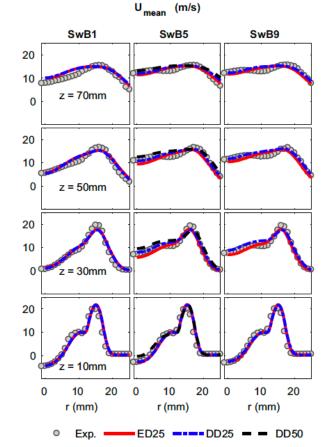


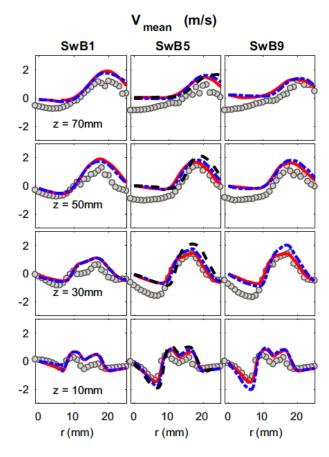


[1] H. Turkeri, X. Zhao, S. B. Pope and M. Muradoglu, Combustion and Flame, 2019.

### Numerical Results: Mean Velocity Profiles



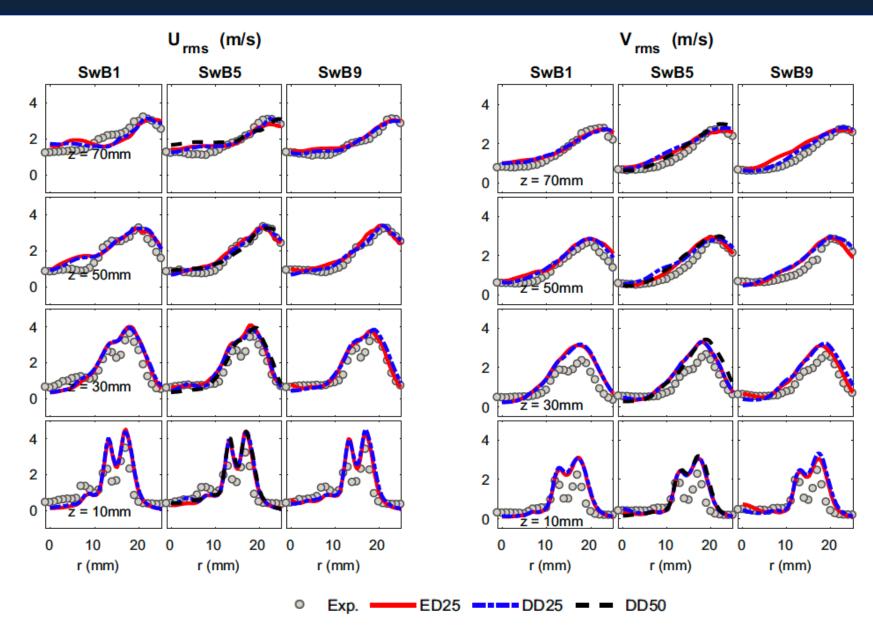




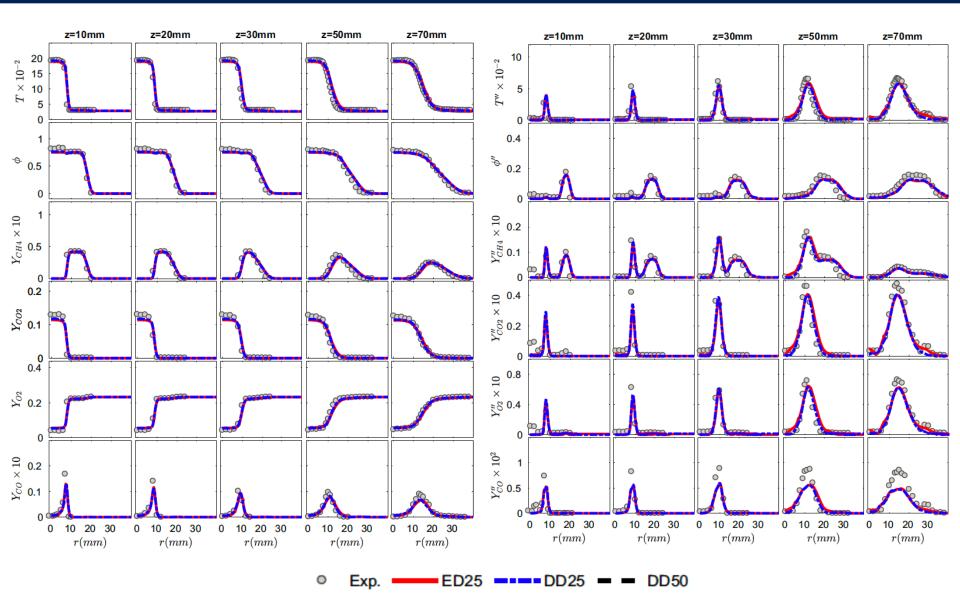
The length of recirculation zones (mm).

Case	DD25	ED25	DD50	Exp.
SwB1	23	23.25	-	24
SwB5	13.5	14	10	14.5
SwB9	14	14.5	-	15

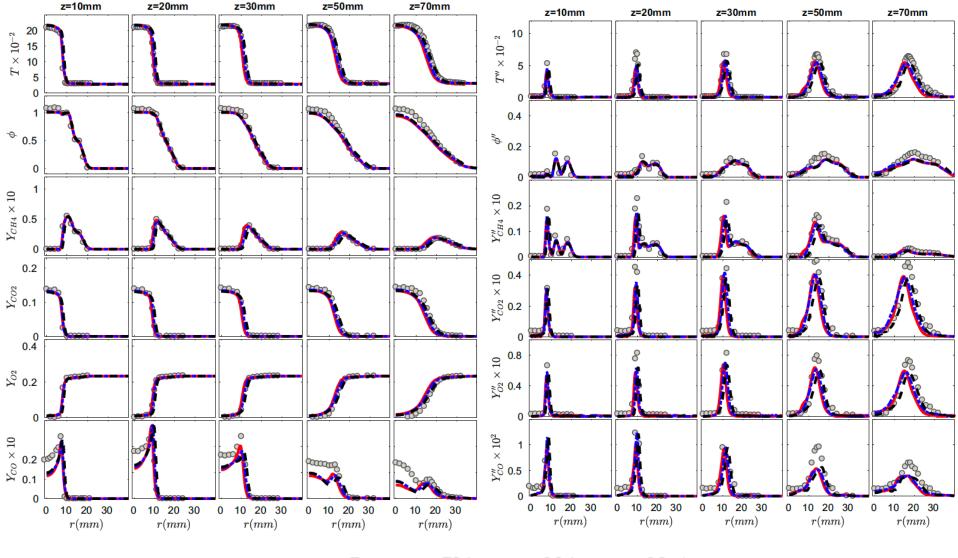
#### Numerical Results: RMS Velocity Profiles



#### Scalar Fields- SwB1 (Premixed)

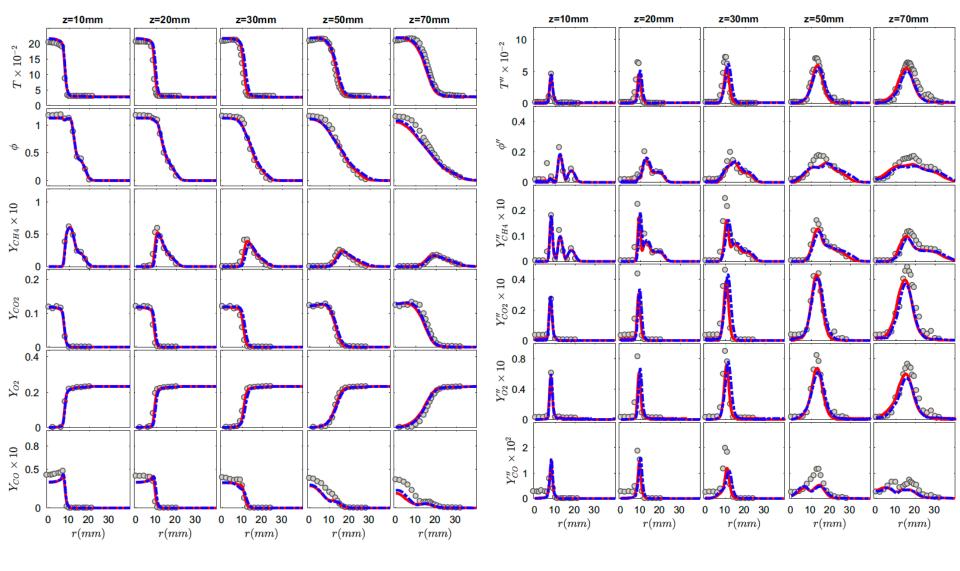


## Scalar Fields- SwB5 (Moderately Stratified)



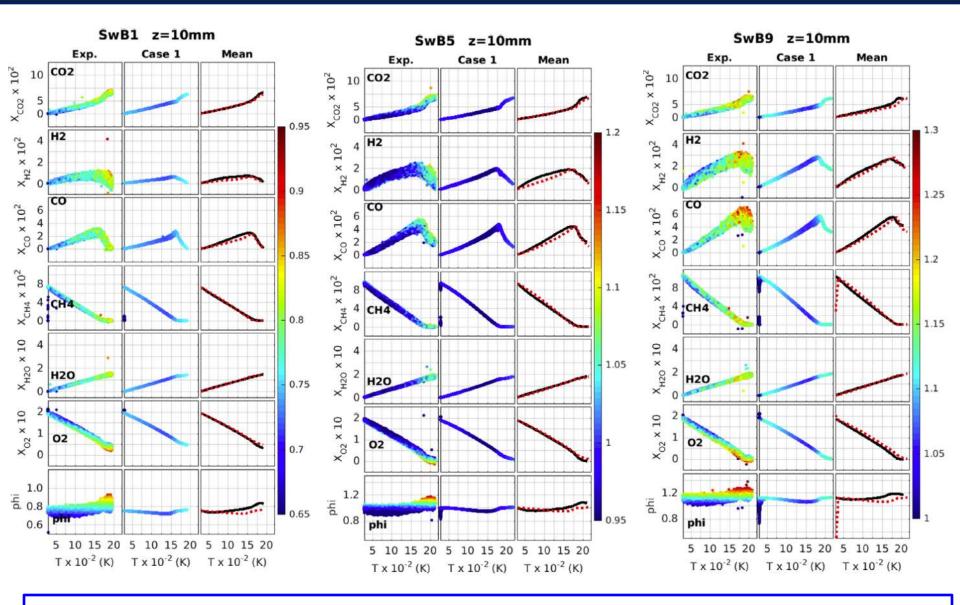
Exp. ED25 DD25 DD25 DD50

### Scalar Fields- SwB9 (Highly Stratified)



Exp. ED25 DD25 DD50

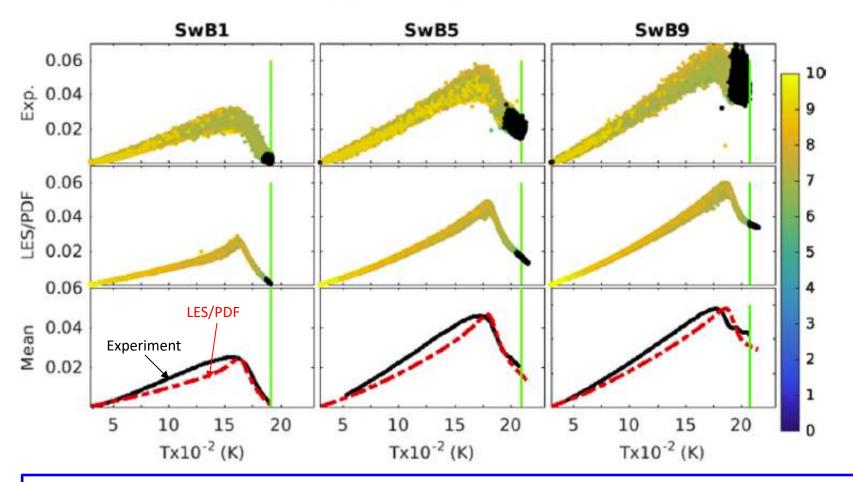
#### **Scatter Plots**



Color-coded by the equivalence ratio. Lines: Conditional mean; Black solid: Exp. Red dotted: comput.

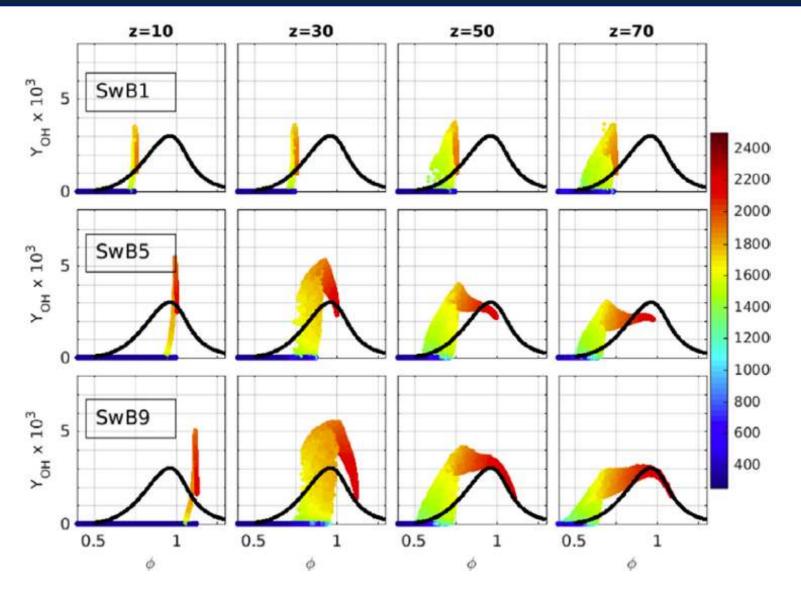
### Scatter Plots of CO

CO | z=10mm



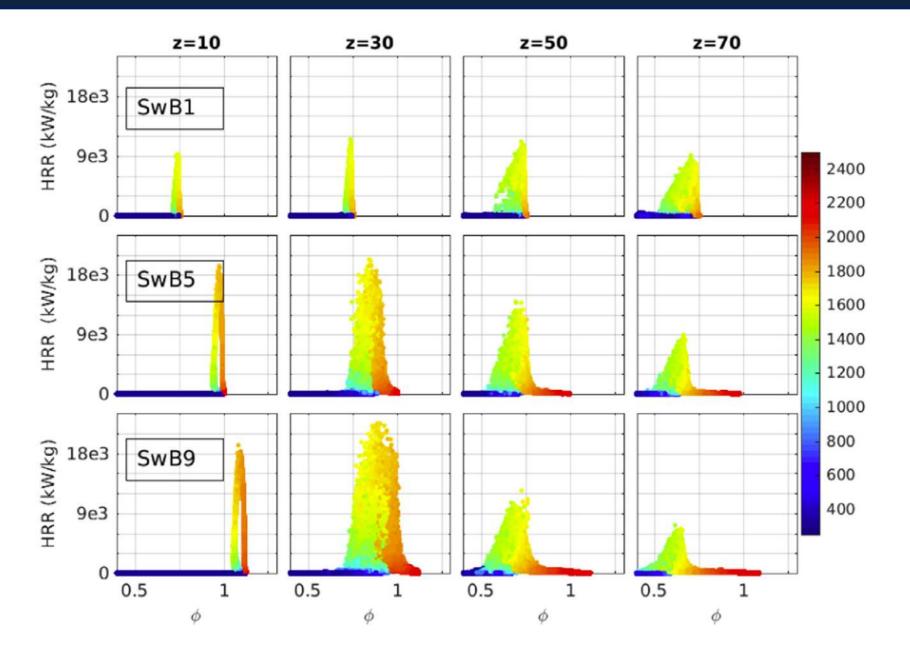
- Color-coded by radial distance
- Black dots: Particles in the recirculation zone, i.e., radial distance < 5 mm
- Black line: Experimental data
- Red line: LES/PDF simulations

#### Effect of stratification (Model: DD25)

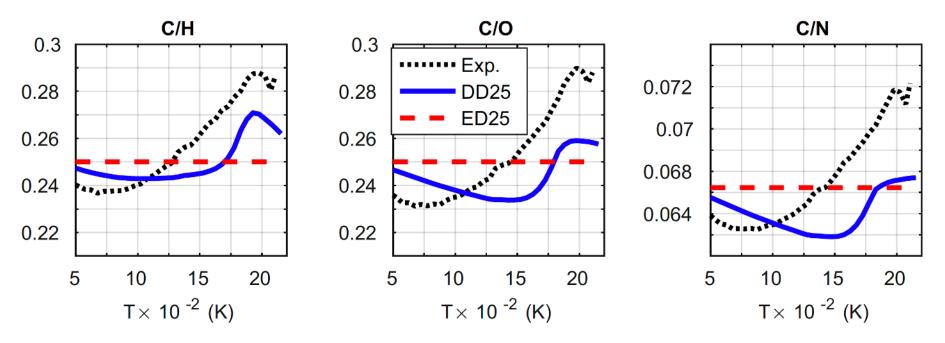


**Solid Lines:** The OH as a function of the equivalence ratio obtained from the chemical equilibrium calculation. Color-coded by temperature. Model: DD25

#### Effects of Stratification on Heat Release Rate (HRR)



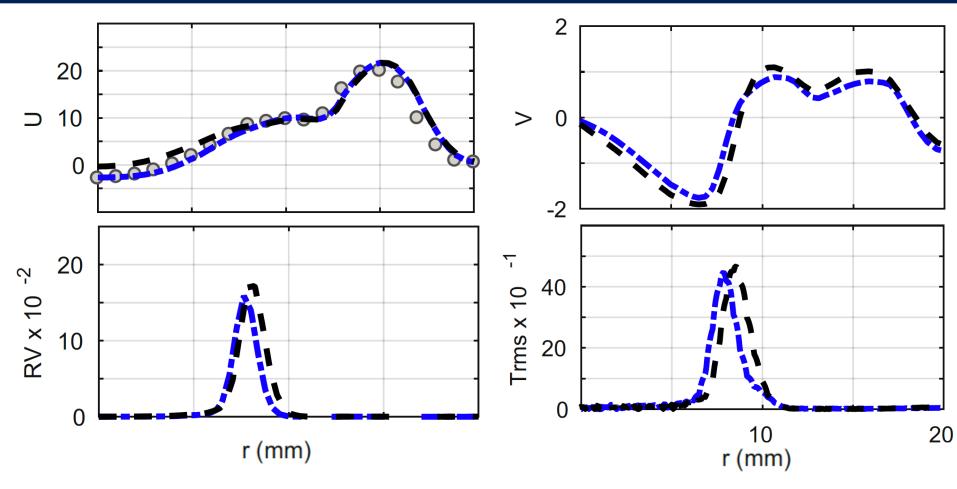
#### **Effects of Differential Diffusion**



The atom ratios C/H, C/O and C/N for the moderately stratified case of SwB5.

Dashed Red Line (ED25): Differential diffusion is off Blue Solid Line (DD25): Differential diffusion is on Black Dotted Line: Experimental data

### Effects of $C_m$ (SwB5)



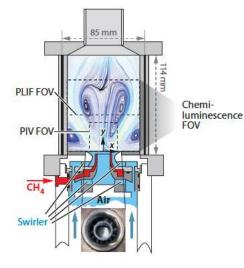
Blue Dash-Dotted Lines:  $C_m = 25$ Black Dashed Lines:  $C_m = 50$ Symbols: Experiment RV = The mean rate of change of specific volume due to mixing and reaction

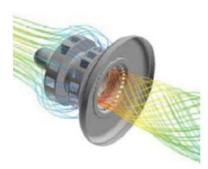


# Cambridge-Sandia Stratified Swirling Flames

### **Swirling Flames**

 Swirling flow is widely used to stabilize lean premixed turbulent flames in gas turbines to satisfy the lowemission restrictions and to reduce the size of the devices by increasing the residence time.







Penanhoat (2006)

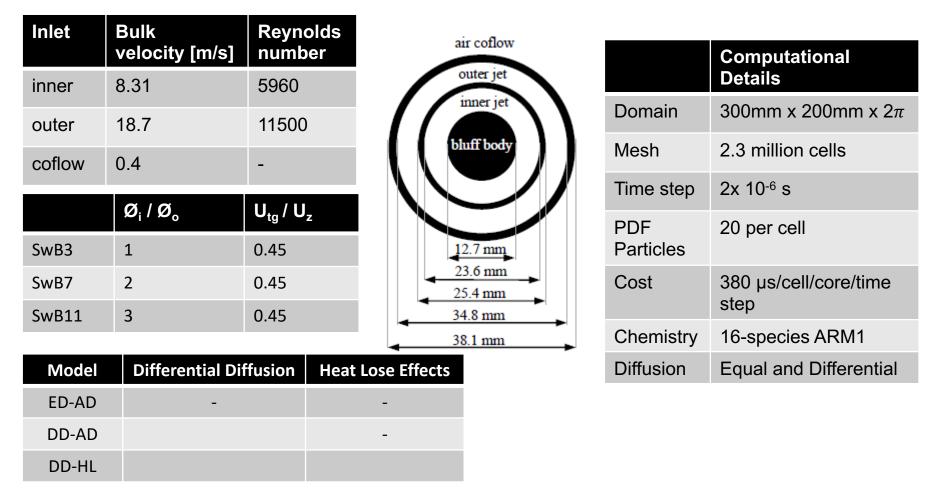
#### **Objectives**:

Steinberg et al. (2010)

- To assess the predictive capability of the LES/PDF methodology for stratified non-swirling and swirling flames.
- To examine the effect of heat lose through the bluff body

#### **Cambridge Stratified Flame Series**

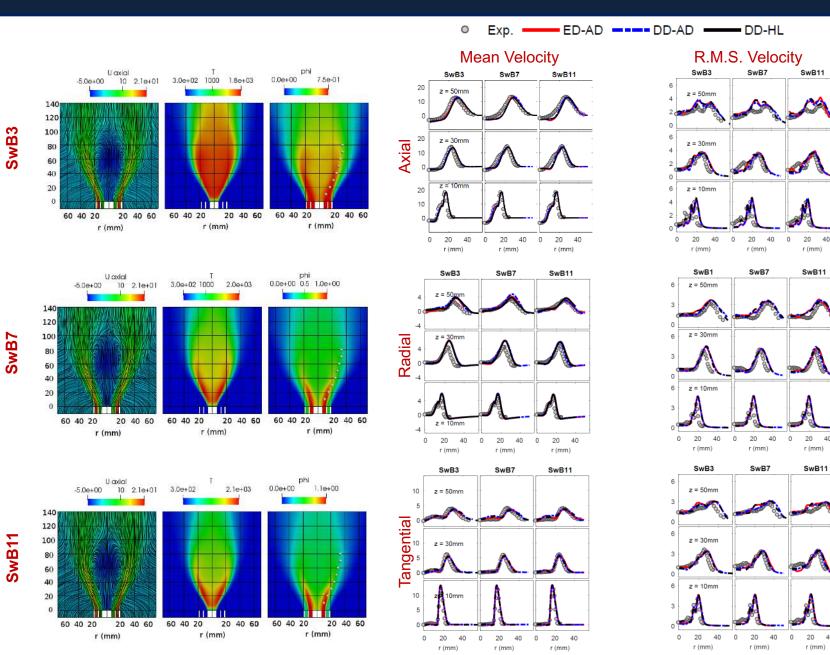
# Designed to investigate the effects of stratification under swirl conditions [1,2,3]



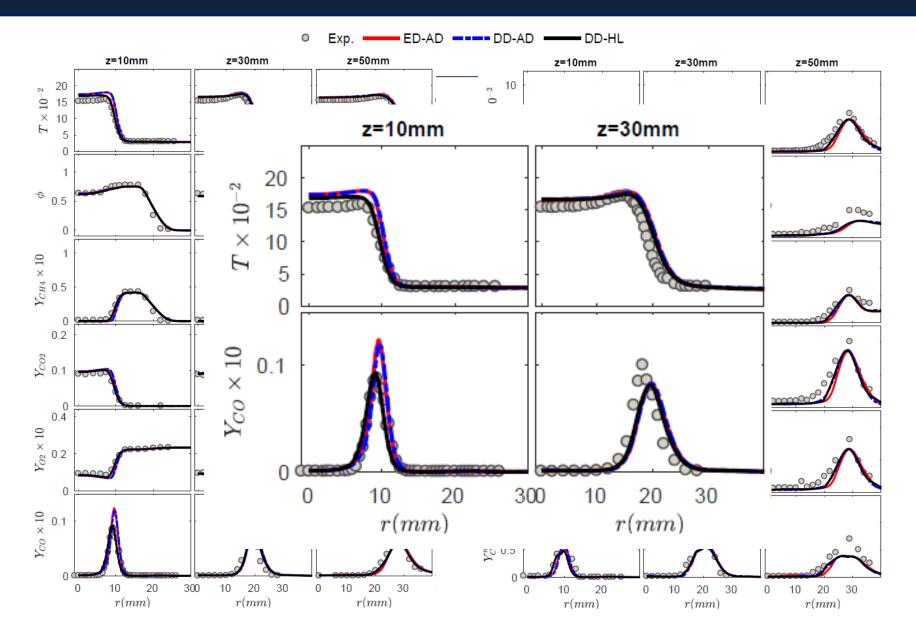
[1] - Sweeney et al., Combust. Flame, 2012 . [2] - Sweeney et al., Combust. Flame, 2012.

[3] - Zhou et al., Combust. Flame, 2012.

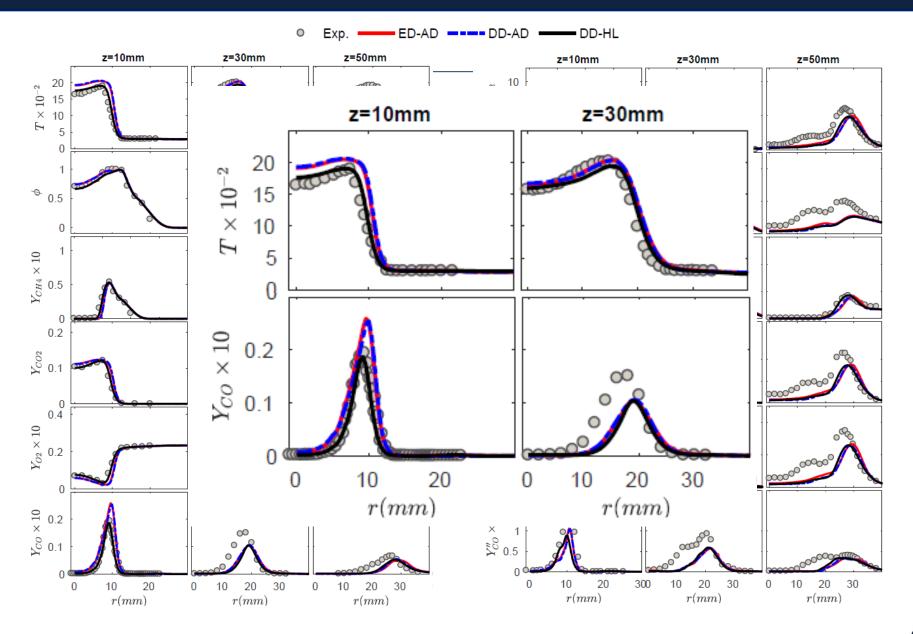
#### Mean Flow Fields



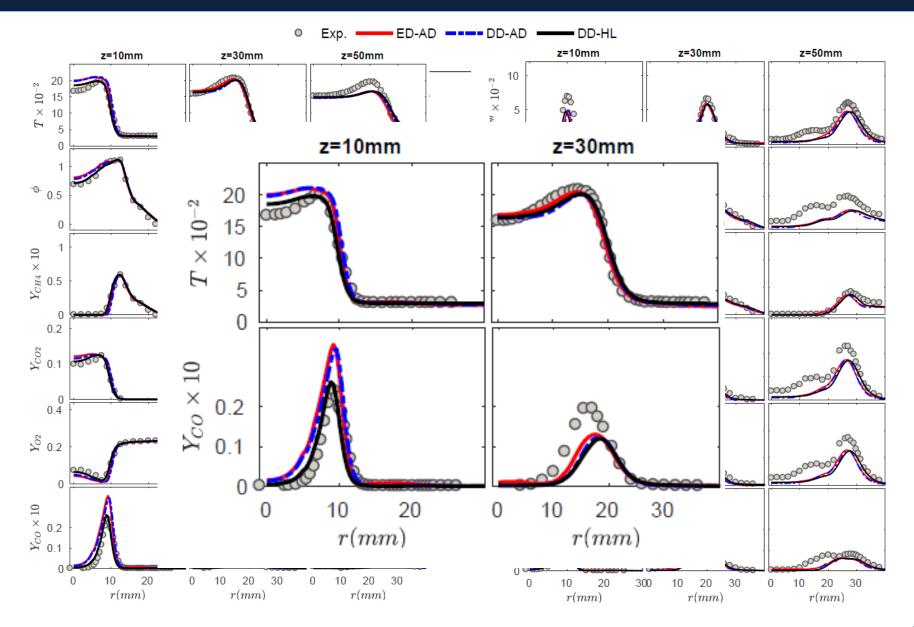
#### Mean and RMS: Premixed Flame – SwB3



#### Mean and RMS: Moderately Stratified– SwB7

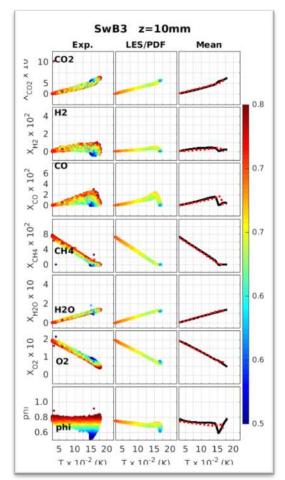


#### Mean and RMS: Highly Stratified– SwB11

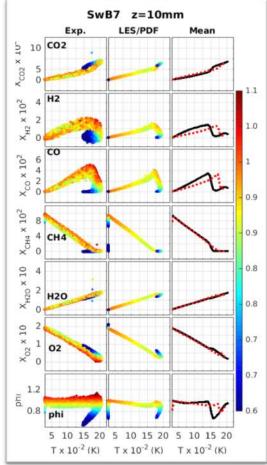


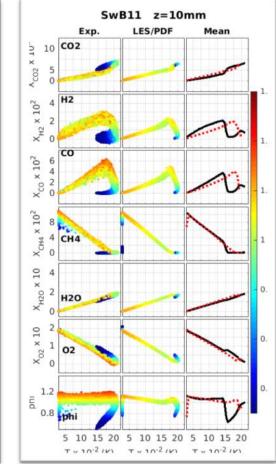
#### **Scatter Plots: Conditional Means**

**Premixed Flame** 



#### Moderately Stratified Flame Highly Stratified Flame





### Conclusions

- The PDF method has a unique advantage of treating arbitrarily non-linear chemical reactions exactly
- The LES/PDF method combines advantages of LES and PDF while avoiding their deficiencies when used alone
- The hybrid LES/PDF simulator developed in OpenFOAM flatform has been shown to perform very well
- The method is designed to work on structured, block-structured and unstructured grids
- The method is found to be very successful in simulating challenging test cases of Cambridge/Sandia non-swirling and swirling stratified flames
- The method can be used as a design tool in actual combustor simulations

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#### • Collaborators:

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- Prof. Xinyu Zhao (University of Connecticut)
- Dr. Hasret Turkeri (TEI)

## Thank you!