# High-Order Large Eddy Simulation of Premixed Turbulent Flames

Luiz Tobaldini Neto

University of Toronto Institute for Aerospace Studies

Doctoral Examination Committee Meeting 4 November 10, 2014

#### Motivation

- Fossil fuels remain the principal sources of energy worldwide until 2035 and renewables grow rapidly [IEA, 2012];
- Combustion: very high energy density, fast transformation
- Aeronautics, Energy Generation, Automotive Engines...;
- Many efforts in green energy include/count on combustion systems (biofuels);
- Efficient combustion simulation: important role in systems design and emissions controls;
- Practical combustion devices are all turbulent;
- Complex features: (chemistry + turbulence + geometry);
- High-order schemes can bring cost reduction, higher fidelity to combustion simulations;

#### Literature Review

- High-Order(HO): typically for Direct Numerical Simulation (DNS), structured grids. Practical Large Eddy Simulation (LES): 2<sup>nd</sup> or 3<sup>rd</sup> accurate [van der Hoeven et al, 2007, Albouze et al, 2009, Poinsot, 2010];
- Franzelli *et al*[2012] use 3<sup>rd</sup>-order Finite Elements(FE) for combustion instabilities on a swirled combustor;
- High Order-LES, Finite Differences (FD) for CH<sub>4</sub> combustion [Yaldizli et al, 2010]
- 5<sup>th</sup>-order FD: gaseous detonations [Wang et al, 2012];
- 2<sup>nd</sup>-order, LES Finite Volumes: combustion in gas turbines [Fureby, 2009];
- High-Order Discontinuous Galerkin for combustion [Lv and Ihme, 2013];

To our knowledge not much has been done in high order finite volume LES for combustion.

#### Proposal

#### **Existing Framework**

- Parallelization and AMR for RANS by Gao [2008];
- 2D High-Order (4th) by Ivan and Groth [2011];
- 3D High-Order (4th) structured [Ivan et al, 2012] and unstructured [Charest et al, 2012]
- PCM-FPI: LES by Hernàndez-Pérez et al[2010], RANS by Jha and Groth [2011];

#### This Research

3D finite volume scheme using high-order LES turbulence model and tabulated chemistry to simulate turbulent premixed flames.

### Filtered Governing Equations

$$\frac{\partial \bar{\rho}}{\partial t} + \frac{\partial (\bar{\rho}\tilde{u}_j)}{\partial x_j} = 0, \qquad (1)$$

$$\frac{\partial(\bar{\rho}\bar{u}_i)}{\partial t} + \frac{\partial(\bar{\rho}\bar{u}_i\bar{u}_j + \delta_{ij}\bar{\rho})}{\partial x_j} - \frac{\partial \hat{\tau}_{ij}}{\partial x_j} = \bar{\rho}g_i + \underbrace{\frac{\partial\sigma_{ij}}{\partial x_j}}_{II} + \underbrace{\frac{\partial(\bar{\tau}_{ij} - \hat{\tau}_{ij})}{\partial x_j}}_{II}, \tag{2}$$

$$\frac{\partial [\bar{\rho}\tilde{E}]}{\partial t} + \frac{\partial [(\bar{\rho}\tilde{E} + \bar{p})\tilde{u}_{j}]}{\partial x_{j}} - \frac{\partial (\bar{\tau}_{ij}\tilde{u}_{i})}{\partial x_{j}} + \frac{\partial \check{q}_{j}}{\partial x_{j}} = \bar{\rho}\tilde{u}_{i}g_{i} - \underbrace{\frac{\partial [\bar{\rho}(\widetilde{h_{s}}u_{j} - \check{h}_{s}\tilde{u}_{j})]}{\partial x_{j}}}_{\text{III}} + \underbrace{\frac{\partial (\bar{\tau}_{ij}u_{i} - \check{\tau}_{ij}\tilde{u}_{i})}{\partial x_{j}} - \frac{\partial (\bar{q}_{i} - \check{q}_{j})}{\partial x_{j}}}_{\text{IV}} - \underbrace{\frac{1}{2}\frac{\partial [\bar{\rho}(\widetilde{u_{j}}u_{i}u_{i} - \tilde{u}_{j}\widetilde{u_{i}}u_{i})]}{\partial x_{j}}}_{\text{VI}} - \underbrace{\frac{\partial [\sum_{\alpha=1}^{N} \Delta h_{f_{\alpha}}^{0} \bar{\rho}(\widetilde{Y_{\alpha}}u_{j} - \widetilde{Y_{\alpha}}\tilde{u}_{j})]}{\partial x_{j}}}_{\text{VII}}, \tag{3}$$

$$\frac{\partial(\bar{\rho}\tilde{Y}_{\alpha})}{\partial t} + \frac{\partial(\bar{\rho}\tilde{Y}_{\alpha}\tilde{u}_{j})}{\partial x_{j}} + \frac{\partial\tilde{\mathcal{J}}_{j,\alpha}}{\partial x_{j}} = -\underbrace{\frac{\partial[\bar{\rho}(\widetilde{Y_{\alpha}u_{j}} - \tilde{Y}_{\alpha}\tilde{u}_{j})]}{\partial x_{j}}}_{\text{VIII}} - \underbrace{\frac{\partial(\bar{\mathcal{J}}_{j,\alpha} - \tilde{\mathcal{J}}_{j,\alpha})}{\partial x_{j}}}_{\text{IX}} + \underbrace{\tilde{\omega}_{\alpha}}_{\text{X}}, \tag{4}$$

### PCM-FPI - Chemistry Model

Flame Prolongation of Intrinsic Low-Dimensional Manifold (FPI) [Gicquel *et al*, 2000] combined with PCM - Presumed Conditional Moments [Vervisch *et al*, 2004]

- Create tables of  $\varphi_j^{\text{FPI}} = (Y_j \text{ or } \dot{\omega}_j)$  from detailed simulations of simple flames (premixed, steady-state, 1D, laminar);
- Selected species (10): 99% of mass, energy and heat release;
- Map  $\varphi_i^{\mathrm{FPI}}$  to  $Y_{\mathrm{c}}$ -space.
- $\tilde{\dot{\omega}}_{lpha}=f(\dot{\omega}_{lpha}, {\sf presumed PDF} \ {\sf for the scalar fluctuations});$
- Different PDFs possible, in this work:  $\beta$ -PDF, modified laminar flamelet based (MLPDF) [Jin *et al*, 2008];
- Solve transport equations for the progress of reaction variable and its variance;

### High-Order Finite-Volume Formulation

#### Integral Form of the Governing Equations

$$\frac{\mathrm{d}\overline{\mathbf{U}}}{\mathrm{d}t} = -\frac{1}{V} \iint\limits_{A} \left( \vec{\mathcal{F}}^{\mathrm{I}} - \vec{\mathcal{F}}^{\mathrm{V}} \right) \cdot \hat{\mathbf{n}} \mathrm{d}\mathcal{A} + \overline{\mathbf{S}}.$$

Using a two-dimensional Gauss quadrature integration rule:

$$\frac{\mathrm{d}\overline{\mathbf{U}}_{ijk}}{\mathrm{d}t} = -\frac{1}{V_{ijk}} \sum_{l=1}^{N_f} \sum_{m=1}^{N_G} \left( \omega \left( \vec{\mathcal{F}}^{\mathrm{I}} - \vec{\mathcal{F}}^{\mathrm{V}} \right) \cdot \hat{n} A \right)_{ijk,l,m} + \overline{\mathbf{S}}_{ijk} = \overline{\mathbf{R}}_{ijk} \left( \overline{\mathbf{U}} \right)$$

- Solution reconstruction
- Interface flux evaluation
- Source vector evaluation
- Time marching

#### Solution Reconstruction

• Reconstruction: to assume some form of spatial distribution of solution quantities in each cell,  $\mathbf{U}_{ijk}(\vec{x})$ ,

$$\mathbf{U}_{ijk}^{k}(\vec{x}) = \sum_{\substack{p_1=0 \ (p_1+p_2+p_3 \le k)}}^{k} \sum_{p_3=0}^{k} (x - x_{ijk})^{p_1} (y - y_{ijk})^{p_2} (z - z_{ijk})^{p_3} D_{p_1p_2p_3} + \mathcal{O}(\Delta^{k+1})$$

where

$$D_{p_1p_2p_3} = \frac{1}{p_1!p_2!p_3!} \frac{\partial^{p_1}U}{\partial x^{p_1}} \frac{\partial^{p_2}U}{\partial y^{p_2}} \frac{\partial^{p_3}U}{\partial z^{p_3}}$$

- Piecewise-constant reconstruction: k = 0;
- Piecewise-linear reconstruction: k = 1;
- Higher-order k-exact reconstructions:  $k \ge 2$ ;
- For  $k \ge 1$ , solution monotonicity needs to be enforced.

#### Reconstruction - Smoothness Indicator

- CENO uses fixed central stencil for reconstruction;
- Near discontinuities, under-resolved regions high-order k-exact reconstruction produces oscillatory behaviour;
- Smoothness indicators decide whether high-order k-exact reconstruction is used in a cell;
- Near discontinuities, CENO scheme is reverted to limited piecewise-linear reconstruction

$$\mathcal{S} = rac{\gamma}{\max\left((1-\gamma),\epsilon
ight)} rac{(M-N)}{(N-1)}, \ \gamma = 1 - rac{\sum_{eta} \left(U_{eta}^{m{k}}(x_{eta},y_{eta},z_{eta}) - U_{lpha}^{m{k}}(x_{eta},y_{eta},z_{eta})
ight)^2}{\sum_{eta} \left(U_{eta}^{m{k}}(x_{eta},y_{eta},z_{eta}) - \overline{U}_{lpha}
ight)^2}.$$

#### Generic Hexahedral - Trilinear Transformation

- Use Gauss-Legendre quadrature rules, as defined on a Cartesian reference domain (cube);
- Transform points and weights from reference space (Cartesian) into physical space (hexahedral) using a trilinear description;

$$\vec{r}(p,q,r) = \vec{A} + \vec{B}p + \vec{C}q + \vec{D}r + \vec{E}pq + \vec{F}pr + \vec{G}qr + \vec{H}pqr$$
 (5)

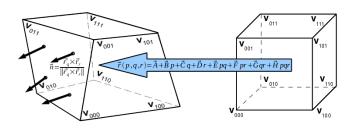


Figure: from Ivan et al. [2012]

### Trilinear Transformation - Volumetric Integral

$$\mathcal{I} = \int_{0}^{1} \int_{0}^{1} \int_{0}^{1} g(\vec{r}(p,q,r)) \det \mathbf{J} dp dq dr$$
 (6)

$$\mathcal{I} \simeq \sum_{m=1}^{N_{GV}} g\left(\vec{r}(p_m, q_m, r_m)\right) \left(\det \mathbf{J}\right)_m \, \omega_m = \sum_{m=1}^{N_{GV}} g(\vec{X}_m) \, \tilde{\omega}_m \qquad (7)$$

- $\vec{X}_m = \vec{r}(p_m, q_m, r_m)$  GL abscissa in physical space;
- $\tilde{\omega}_m = (\det \mathbf{J})_m \ \omega_m$  weight in physical space.

### Trilinear Transformation - Surface Integral

Example for constant r=1;

$$\mathcal{I}_{\mathsf{face}} = \int_{0}^{1} \int_{0}^{1} g(\vec{r}(p, q, 1)) \left| \frac{\partial \vec{r}}{\partial p} \times \frac{\partial \vec{r}}{\partial q} \right| dp dq \tag{8}$$

$$\mathcal{I}_{\mathsf{face}} \simeq \sum_{m=1}^{N_{GF}} g\left(\vec{r}(p_m, q_m, 1)\right) \left(\mathbf{J}_{\mathsf{face}, m}\right) \omega_f = \sum_{m=1}^{N_{GF}} g(\vec{X}_m) \tilde{\omega}_m \quad (9)$$

- $\mathbf{J}_{\text{face},m} = \left( \left| \frac{\partial \vec{r}}{\partial p} \times \frac{\partial \vec{r}}{\partial q} \right| \right)_m$
- $\vec{X}_m = \vec{r}(p_m, q_m, 1)$  GL abscissa in physical space;
- $\tilde{\omega}_m = (\det \mathbf{J})_m \ \omega_m$  weight in physical space.

#### Inviscid Flux Evaluation

$$\frac{\mathrm{d}\overline{\mathbf{U}}_{ijk}}{\mathrm{d}t} = -\frac{1}{V_{ijk}} \sum_{l=1}^{N_f} \sum_{m=1}^{N_{GF}} \left( \widetilde{\omega}_m \left( \vec{\mathcal{F}}^{\mathrm{I}} - \vec{\mathcal{F}}^{\mathrm{V}} \right) \cdot \hat{n} \right)_{ijk,l,m} + \overline{\mathbf{S}}_{ijk} = \overline{\mathbf{R}}_{ijk} \left( \overline{\mathbf{U}} \right)$$

- At a quadrature point in each cell interface, a Riemann problem must be solved
- ullet  $ec{\mathcal{F}}^{I}\cdot\hat{ extit{n}}=ec{\mathcal{F}}^{I}\left( extbf{U}_{\mathrm{left}}, extbf{U}_{\mathrm{right}},\hat{ extit{n}}
  ight)$
- AUSM<sup>+</sup>-up [Liou (2006)]

#### Viscous Flux Evaluation

$$\frac{\mathrm{d}\overline{\mathbf{U}}_{ijk}}{\mathrm{d}t} = -\frac{1}{V_{ijk}} \sum_{l=1}^{N_f} \sum_{m=1}^{N_{GF}} \left( \widetilde{\omega}_m \left( \vec{\mathcal{F}}^{\mathrm{I}} - \vec{\mathcal{F}}^{\mathrm{V}} \right) \cdot \hat{\boldsymbol{n}} \right)_{ijk,l,m} + \overline{\mathbf{S}}_{ijk} = \overline{\mathbf{R}}_{ijk} \left( \overline{\mathbf{U}} \right)$$

• At each quadrature point in a cell interface  $(i + \frac{1}{2}, j, k)$ :

$$\vec{\mathcal{F}}_{i+\frac{1}{2}j,k}^{\mathrm{V}} \cdot \hat{\boldsymbol{n}} = \vec{\mathcal{F}}^{\mathrm{V}} \left( \boldsymbol{\mathsf{U}}_{i+\frac{1}{2},j,k}, \vec{\nabla} \boldsymbol{\mathsf{U}}_{i+\frac{1}{2},j,k} \right).$$

- Interface states and gradients are arithmetic mean of left and right states and gradients, respectively
- These states and gradients are reconstructed without limiting

$$\begin{array}{lll} U_{ijk}^{k}(x,y,z) & = & \sum\limits_{\rho_{1}=0}^{k}\sum\limits_{\rho_{2}=0}^{k}\sum\limits_{\rho_{3}=0}^{k}\left(x-x_{ijk}\right)^{\rho_{1}}\left(y-y_{ijk}\right)^{\rho_{2}}\left(z-z_{ijk}\right)^{\rho_{3}}D_{\rho_{1}\rho_{2}\rho_{3}}+\mathcal{O}\left(\Delta^{k+1}\right)\\ & & \left(p_{1}+p_{2}+p_{3}\leq k\right) \end{array}$$
 
$$\frac{\partial U_{ijk}^{k}(x,y,z)}{\partial x} & = & \sum\limits_{\rho_{1}=1}^{k}\sum\limits_{\rho_{2}=0}^{k}\sum\limits_{\rho_{3}=0}^{k}\rho_{1}\left(x-x_{ijk}\right)^{\rho_{1}-1}\left(y-y_{ijk}\right)^{\rho_{2}}\left(z-z_{ijk}\right)^{\rho_{3}}D_{\rho_{1}\rho_{2}\rho_{3}}+\mathcal{O}\left(\Delta^{k}\right) \end{array}$$

14/36

#### Research Progress

#### DEC I

 Preliminary works with Trilinear Transformation and Gauss Quadrature

#### **DEC II**

- Function Reconstructions/Euler in non-Cartesian meshes
- Extension of CENO High-Order to non-reactive LES solver
- Application to Isotropic Turbulence Decay

#### DEC III

- Extension CENO High-Order to reactive LES solver (PCM-FPI)
- Application to Freely Propagating Flame in a 3D Cartesian Box

#### Planned Work for DEC IV

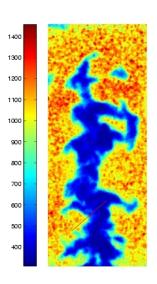
- High Order PCM-FPI Code Optimization (evolution of preliminary implementation used last year to avoid unnecessary Reconstructions)
- Application of the method to laboratory premixed Bunsen-type flame
- Cost Assesment: fourth-order compared to second-order;

#### Code Optimization

- Initial version of the PCM-FPI implementation relied on the reconstruction machinery for all variables (8 transported  $\pm$  10 species);
- Idea of limiting the use of reconstruction machinery only to transported variables (8);
  - Read species mass fractions from tables instead of reconstructing;
  - Requires updating species from tables after block communications;
  - Use of chain rule for species spatial derivatives;
  - Measured gains on the order of 30%-40%;
  - Similar modifications extended to second-order code;

#### Laboratory Scale Turbulent Premixed Burner

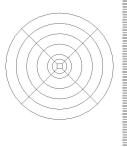
- Axisymmetric Bunsen-type burner of Yuen & Gülder (2009)
- 11.2 mm diameter burner nozzle, annular pilot flame
- Premixed methane/air & propane/air flames, range of fuel mixtures & turbulence intensities, atmospheric pressures
- Rayleigh scattering and PIV measurements

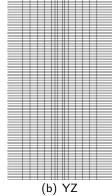


### Computational Studies for Case N - Methane - $\phi = 0.7$

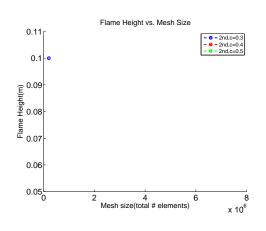
٨	$\lambda$	$\eta$	u'	$s_{ m L}$	$\delta_{ m L}$	$u'/s_{ m L}$	$\Lambda/\delta_{ m L}$
mm	mm	mm	m/s	m/s	mm		
1.790	0.460	0.02935	2.92	0.201	0.11	14.38	16.64

Mesh Size	Spatial Order
200,000	2 <sup>nd</sup> , 4 <sup>th</sup>
690,000	2 <sup>nd</sup> , 4 <sup>th</sup>
1,600,000	2 <sup>nd</sup> , 4 <sup>th</sup>
6.400.000	2 <sup>nd</sup>

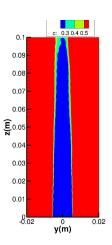




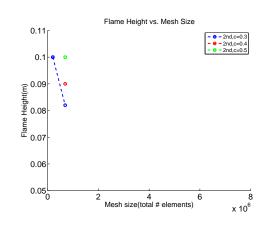
(a) XY



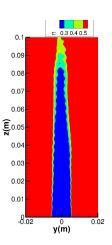
(c) Flame Height vs Mesh Size



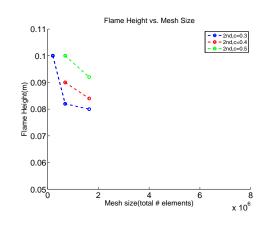
(d)  $2^{nd}$  order, N=200,000 elements



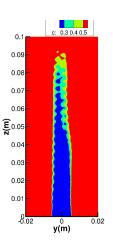
(e) Flame Height vs Mesh Size



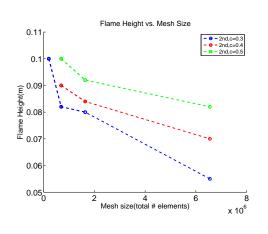
(f)  $2^{nd}$  order, N=690,000 elements



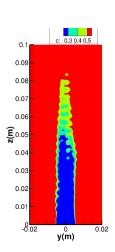
(g) Flame Height vs Mesh Size



(h)  $2^{nd}$  order, N=1,600,000 elements

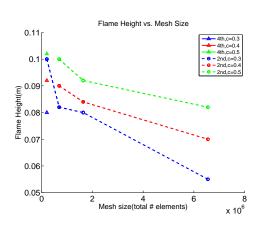


(i) Flame Height vs Mesh Size

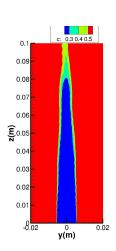


(j)  $2^{nd}$  order, N=6,400,000 elements

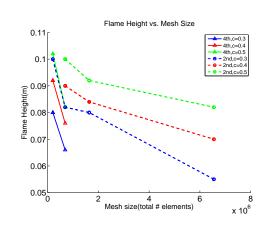
23/36



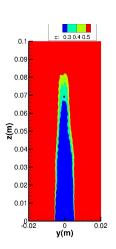
(k) Flame Height vs Mesh Size



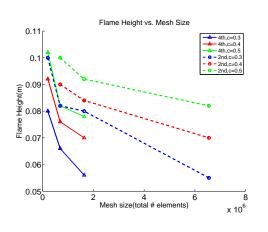
(I)  $4^{th}$  order, N=200,000 elements



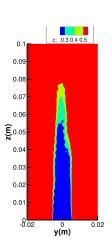
(m) Flame Height vs Mesh Size



(n)  $4^{th}$  order, N=690,000 elements

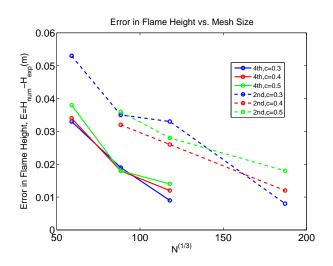


(o) Flame Height vs. Mesh Size

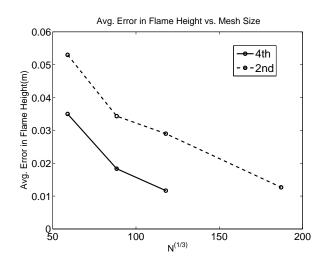


 $\begin{array}{lll} \text{(p)} & 4^{\textit{th}} & \text{order,} \\ \text{N=1,600,000} & \text{elements} \end{array}$ 

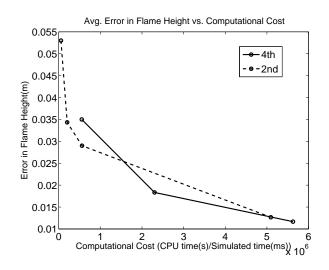
# Error Relative to Experiment - $N^{1/3}$



# Avg. Error Relative to Experiment - $\mathsf{N}^{1/3}$



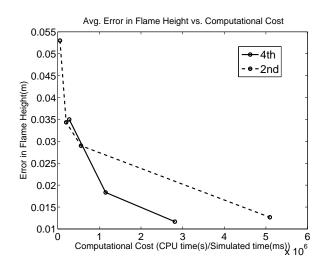
### Avg. Error Relative to Experiment vs Cost RK4



Luiz Tobaldini Neto

29/36

### Avg. Error Relative to Experiment vs Cost RK2



30/36

#### Conclusion

- Similar levels of representation of experimental results were obtained with second-order and fourth-order scheme. For this problem the effect of order of time-marching scheme was negligible in the results but substantial in cost;
- Substantial gains in computational cost can be realized with the use of a high-order spatial discretization to achieve the same level of representation of experimental results when compared to a second-order scheme;
- Same level of representation of experiments with coarser mesh  $\rightarrow$  easier data management/post processing (more relevant for large number of cases);

### Progress Since Previous Meeting

- Code optimization achieving 30-40% reduction in computational cost for the high-order framework;
- Extension to the second-order scheme of the applicable modifications made to the high-order framework;
- Application of the high-order framework to the simulation of a laboratory scale Bunsen burner.
- Mesh refinement study for the high-order and second-order schemes;
- Cost analysis of CENO high-order vs. second-order method showing substantial gains (2-4 times less expensive) in computational cost for same level of representation of experimental results;
- AIAA Scitech (January/2014 National Harbour, MD, USA);
- CI/CS Spring Meeting (May/2014 Windsor, ON);
- 3 22<sup>nd</sup> Annual Conference CFDSC (June/2014 Toronto, ON);

Luiz Tobaldini Neto

32/36

### Summary of the contributions of the present work

- Collaboration in the implementation and testing of the trilinear transformation within the high-order framework, extending the ability of the code to handle non-orthogonal hexahedral elements;
- Extension of the high-order framework to handle reactive flows by implementing a high-order for the LES of turbulent premixed flames using the PCM-FPI model (tabulated chemistry coupled with a presumed PDF);
- First application of the compressible CENO high-order scheme to the LES of laboratory scale premixed flames (Bunser burner). To our knowledge this is one of the first applications of a high-order, classic (conservative, Godunov-type) compressible, finite-volume scheme to combustion problems;
- Performed a systematic cost assessment comparing the high-order scheme and second-order scheme using different mesh refinements for a premixed Bunsen burner laboratory flame, demonstrating the benefits of the high-order scheme in reducing the computational cost of these simulations and encouraging further research in this area;

#### Final Steps

- Run the mesh convergence study for the second-order scheme varying the filter width, having the filter/grid ratio constant;
- Spot checks for sensitivity analysis (cost vs. accuracy): e.g.
  vary number of volumetric quadrature points or FPI table size,
  test intermediate third-order spatial scheme;
- Organization of final thesis document (has been continuously conducted).

#### Acknowledgements

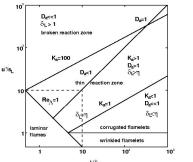
- Embraer S.A Brazil;
- CNPq- Science Without Borders Brazil;
- MITACS Canada;
- Scinet (Computational Resources) Canada;

### Thank You!

Questions?

#### **Turbulent Premixed Combustion**

- Reactants perfectly mixed at the molecular level before entering reactor;
- Practical combustion devices are all turbulent;
- Turbulent flows  $\rightarrow$  wide range of length and time scales



 $\Lambda = integral length scale$  $\delta_{\rm L} =$  laminar flame thickness u' = RMS velocity fluctuation  $s_{\rm L} = {\sf laminar flame speed}$  $Da = \frac{\Lambda/u'}{\delta_{\rm T}/s_{\rm T}}$  $Ka = \frac{\delta_{\rm L}/s_{\rm L}}{n/u'_{\rm L}}$ 

 $\eta = \text{Kolmogorov length scale}$ 

Regime diagram for premixed turbulent combustion

- IEA. World Energy Outlook 2012. Technical report, International Energy Agency, 2012.
- C. Fureby. Large eddy simulation modelling of combustion for propulsion applications. Philosophical Transactions of the Royal Society of London A, 367:2957–2969, 2009.
- Y. Lv and M. Ihme. Higher-order discontinuous galerkin method for application to realistic combustion problems. In 14th International Conference on Numerical Combustion, volume 32, San Antonio, USA, 2013.
- X. Gao. A Parallel Solution-Adaptive Method for Turbulent Non-Premixed Combusting Flows. PhD thesis, University of Toronto, August 2008.
- L. Ivan and C. P. T. Groth. High-order solution-adaptive central essentially non-oscillatory (CENO) method for viscous flows. Paper 2011-0367, AIAA, January 2011.
- Pradeep Kumar Jha and Clinton P. T. Groth. Parallel adaptive mesh refinment scheme with presumed conditional moment and fpi tabulated chemistry for turbulent non-premixed combustion. Paper, AIAA, January 2011.
- L. Ivan, A. Susanto, H. De Sterck, and C.P.T. Groth. High-order Central ENO finite-volume scheme for MHD on three-dimensional cubed-sphere grids. In Seventh International Conference on Computational Fluid Dynamics (ICCFDT), page 1, July 2012.