# **Reduced Basis and Stochastic Modeling of Liquid Propellant Rocket Engine as a Complex System**

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The treatment of combustion and flow processes in a liquid-propellant rocket engine as a complex system using a confluence of advanced mathematical methods is aimed to understand and characterize nonlinear triggering, transient oscillations, and limit-cycle oscillations at supercritical pressures.

- Complex systems involve stochastic behaviors of semi-autonomous components networked in a way that allows emergent behavior to develop.
- Our complex system components will include combustion chamber, convergent nozzle, propellant injectors, and all flow and thermal structures.
- Uncertainties that justify stochastic approach relate to magnitude, duration, and location of triggering disturbances; property values in supercritical domain.
- Stochastic processes may apply to fluctuations in propellant flow rates, fluctuations in fluid properties, and flow turbulence.
- Emergent structures of interest include large-amplitude acoustic oscillation.
- Stochastic terms may enter analysis as initial conditions, boundary conditions, or directly into differential equations as forcing functions or coefficients.
- Reduced Basis Modeling (RBM) coupled with LES will provide a rapid, efficient, and accurate analysis for the intensive stochastic computations.

| Report Documentation Page  |                                  |                              |                                     | Form Approved<br>OMB No. 0704-0188           |                    |  |
|--|----------------------------------|------------------------------|-------------------------------------|--|--------------------|--|
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| 1. REPORT DATE<br>SEP 2012   | EPORT DATE P 2012 2. REPORT TYPE |                              |                                     | 3. DATES COVERED<br>00-00-2012 to 00-00-2012 |                    |  |
| 4. TITLE AND SUBTITLE  |                                  |                              |                                     | 5a. CONTRACT NUMBER                          |                    |  |
| Reduced Basis and Stochastic Modeling of Liquid Propellant Rocket  |                                  |                              |                                     | 5b. GRANT NUMBER                             |                    |  |
| Engine as a Complex System   |                                  |                              |                                     | 5c. PROGRAM ELEMENT NUMBER                   |                    |  |
| 6. AUTHOR(S)   |                                  |                              |                                     | 5d. PROJECT NUMBER                           |                    |  |
|  |                                  |                              |                                     | 5e. TASK NUMBER                              |                    |  |
|  |                                  |                              |                                     | 5f. WORK UNIT NUMBER                         |                    |  |
| 7. PERFORMING ORGANIZATION NAME(S) AND ADDRESS(ES)<br>University of California Irvine,Irvine,CA,92697  |                                  |                              |                                     | 8. PERFORMING ORGANIZATION<br>REPORT NUMBER  |                    |  |
| 9. SPONSORING/MONITORING AGENCY NAME(S) AND ADDRESS(ES)  |                                  |                              |                                     | 10. SPONSOR/MONITOR'S ACRONYM(S)             |                    |  |
|  |                                  |                              |                                     | 11. SPONSOR/MONITOR'S REPORT<br>NUMBER(S)    |                    |  |
| 12. DISTRIBUTION/AVAILABILITY STATEMENT<br>Approved for public release; distribution unlimited   |                                  |                              |                                     |  |                    |  |
| 13. SUPPLEMENTARY NOTES<br>Presented at the 2012 AFOSR Space Propulsion and Power Program Review held 10-13 September in<br>Arlington, VA. U.S. Government or Federal Rights License   |                                  |                              |                                     |  |                    |  |
| 14. ABSTRACT   |                                  |                              |                                     |  |                    |  |
| 15. SUBJECT TERMS  |                                  |                              |                                     |  |                    |  |
| 16. SECURITY CLASSIFIC   | 17. LIMITATION OF                | 18. NUMBER                   | 19a. NAME OF                        |  |                    |  |
| a. REPORT<br>unclassified  | b. ABSTRACT<br>unclassified      | c. THIS PAGE<br>unclassified | ABSTRACT<br>Same as<br>Report (SAR) | OF PAGES<br>10                               | RESPONSIBLE PERSON |  |

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# Program Flow Chart



### **TEAM APPROACH**

- UCI (Sirignano, Sideris, and Popov) will develop stochastic framework. They will formulate stochastic partial differential equations in coordination with Georgia Tech and Hypercomp.
- Georgia Tech (Menon and postdoc) will develop Large-eddy Simulation (LES) approach and make computations for specified realizations in the stochastic behavior.
- Hypercomp (Munipalli and Ota) will develop reduced basis models fitting the LES results. These RBMs will allow inexpensive computations of many realizations for the stochastic analysis.
- KISS (Kassoy) will develop and propose thermoacoustic and thermomechanical models to describe relevant combustion phenomena. Some of this modelling will also be done at UCI (Sirignano).
- Continuing communication and iteration amongst team members will occur.
- The approach and integration of contributions from team members will be tested on model equations as well as with full Navier-Stokes, multicomponent-flow based equations.
- The approach introduces and integrates various advanced mathematical and computational method: stochastic processes; asymptotic analysis; large-eddy simulation; reduced-basis modelling.

#### **Stochastic modeling-Uncertainty quantification**

- General stochastic PDE:  $\mathcal{L}(\mathbf{x}, t, \omega; \mathbf{u}) = \mathbf{f}(\mathbf{x}, t, \omega)$  with  $\mathbf{u}(\mathbf{x}, t, \omega)$  the solution,  $\mathbf{f}(\mathbf{x}, t, \omega)$  a forcing function,  $\mathcal{L}$  a (possibly) nonlinear differential operator,  $t \in [0 T]$  the time variable,  $\mathbf{x} \in D$  spatial variables, and  $\omega \in \Omega$  signifying dependence on random quantities.
- **Polynomial Chaos Expansion (PCE) approximation:**  $u(x, t, \omega) \cong \sum_{i=0}^{N} u_i(x, t) \Phi_i(Z(\omega))$ , with  $Z = (Z_1, ..., Z_d)$  orthornormal RV's, and the  $\Phi_i$  's multi-dimensional orthogonal polynomials.
- Stochastic Galerkin (SG) approach:  $u_i(x, t)$ , are obtained by requiring  $< \mathcal{L}(x, t, \omega; \sum_{i=0}^{N} u_i \Phi_i), \Phi_k > = < f(x, t, \omega), \Phi_k >, k = 0, 1, ..., N$ , which is a system of coupled deterministic PDE's in the  $u_i(x, t)$ 's.
- Stochastic Collocation (SC) approach:  $u_i(x,t) = \frac{1}{\gamma_i} < u(x,t,\omega), \Phi_i(Z(\omega)) > \cong \frac{1}{\gamma_i} \sum_{i=1}^N u(x,t,\omega^{(j)}) \Phi_i(z^{(j)}) w^{(j)}$ , (with  $z^{(j)}, j = 1, ..., M$  samples (quadrature nodes)) are obtained from the deterministic PDE's:  $\mathcal{L}(x,t,\omega^{(j)}; u^{(j)}) = f(x,t,\omega^{(j)})$ .
- Remarks:
  - In both the SG and SC methods, the simulation approach of *Georgia Tech* and *HyPerComp* can essentially be used.
  - From the PCE expansion, statistics for the solution and machine learning tools for the detection of triggered instabilities will be developed.

# **ROM/RBM-LES** Strategy



# Previous Experience and Year 1 - Work Plan @ GT

- POD/ROM analysis of existing LES data underway *Experiments (CVRC-Purdue)* 
  - LOX-GH2 supercritical jet mixing (PSU)
  - GH2-GOX subcritical instability (Purdue)
  - LOX-GCH4 supercritical combustion (CNRS)



Some velocity POD modes for CVRC

Pressure [kPa] -200 Longitudinal mode 10.998 11 11.002 11.004 11.006 Time [sec] in CVRC Combustor LES x 10<sup>5</sup>

400

200

12 13

t (ms)

8 9 10 11 14 15



- Injector flow field characterization for RBM analysis
- Develop post processing tools for on-line and off-line analysis of the LES data
- Team collaboration to provide inputs for stochastic and RBM modelling.

#### The Reduced Basis Method (RBM) – Scope

The goal of RBM is to generate accurate models of the full governing equations with far fewer unknowns – without linearization or other approximations. We are planning for the following uses for RBM in liquid rocket combustion dynamics:

➤ **Parametric calculations, control, optimization:** RBM can be used to span a large parameter space efficiently in large scale computations (e.g., *Re*, mass flow rate, perturbation frequency...) This can be used in designing control laws, and automatic optimization. Due to the averaging property, POD is inefficient in multiparameter systems.

➢ Geometric similarity: To use the RBM with parameterized geometries to model topologically similar domains efficiently

Surrogate models in complex systems: RBMs can be used to represent subsystems such as injectors when interfacing with more complex combustor models - a network of interoperating RBMs may be used.

### **Brief Description of the RBM Method**

 $: \boldsymbol{\psi}_n$ 

The full system of Favre filtered NS equations in LES:

Expand Q (Galerkin technique) in terms of modes

The modes  $\Psi_n$  (usually orthogonal, but not necessarily) are obtained such that this approximation minimizes solution error (defined appropriately) :

The coefficients  $Q_R$  are obtained as solutions to 1<sup>st</sup> order ODEs: (A and P are pre-computed matrices)

$$\frac{\partial Q}{\partial t} + F(Q) = \mathcal{W}$$
$$Q_{RBM}(x,t) = \sum_{n=1}^{N} Q_{R}(t) \psi_{n}(x)$$

 $\left\|Q(x,t)-Q_{RBM}(x,t)\right\|\leq\varepsilon$ 

$$\frac{d Q_R(t)}{d t} = A F(P^T \psi_n(x) Q_R(t)) + \mathcal{W}(\psi_n(x) Q_R(t))$$

Calculation is done in two parts – the first, "offline" procedure constructs a set of basis functions which provide the best representation of computed data.

Next, a set of ODEs are solved "online" where the system is modeled from N unknown modal coefficients  $Q_R$  – note the full CFD solution computes O(K) unknown values where K is the number of cells.

#### Model reduction implies *N* << *K*

Challenges: Determine appropriate modes; Stable, efficient computation of nonlinear fluxes.

#### **KISS Asymptotic Analysis**

- <u>Thermomechanics:</u> Spatially distributed, transient, energy deposition [Q(x,t)] into an isolated volume (hot spot length scale L and acoustic time scale t<sub>A</sub>=L/a, a=local acoustic speed) at a specific rate (heating time scale t<sub>H</sub>). When t<sub>H</sub> << t<sub>A</sub>, there must be a very low Peclet number and is not interesting here (unless radiation dominates). Much slower energy addition (t<sub>H</sub> >> t<sub>A</sub>) occurs at nearly constant pressure. Density decrease causes a small expansion Mach number driving relatively weak mechanical disturbances into the unheated environment. Conceptual outcome: System conversion of thermal to kinetic energy provides a source for mechanical disturbances.
- 2. <u>Thermoacoustics</u>: Linear 1<sup>st</sup> and 2<sup>nd</sup> order, 2D, nonhomogeneous wave equations describe the response of a confined gas to  $Q(\mathbf{x},t)$  when  $t_H=O(t_A)$ . Longitudinal and transverse disturbances can be generated; solutions include a forced response and all the eigenmodes excited by the heat input. Potential nonlinearization can be derived analytically from the 2<sup>nd</sup> order, nonhomogeneous wave equation. Some modes can be immediately unstable. **Conceptual outcome**: Thermoacoustic modeling, describing hyperbolic phenomena is valid when the heating and the acoustic time scales are commensurate.

# SUMMARY

- Innovative approach to explore the triggering mechanism of the instability and the driving mechanism for the nonlinear oscillation.
- Address the multi-injector rocket combustion chamber as a complex system with many semi-autonomous components that affect the nonlinear oscillatory macrobehavior.
- Establish key relations amongst the initiation process, nonlinear resonant oscillation growth, and transient to limit-cycle.
- The combination of new and emerging methodologies may not only aid in addressing the liquid-propellant rocket instability but can have other broader applications.