**Development of advanced hypersonic models for transition to turbulence** 



# **Uncertainty Quantification for Transition prediction**

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## Introduction

#### Why Transition is crucial in Hypersonic?

Planetary reentry/entry vehicles need safely designed heat shield (Fig. 1); - Turbulent heat transfer up to five time higher than the laminar heating rates (Fig. 2);



Figure 1 : Schematic representation of the physics of reentry

What is the current approach in design?



## **Preliminary Results**

**Transition prediction for the oblique breakdown** mechanism in supersonic boundary layers



**1.** Linear Stability Theory code (VESTA by Pinna F. [4]) to compute the N factor for different Frequency (F) and direction ( $\psi$ ) of the oblique waves

- Transfer function :  $N=N(F,\psi)$  (Fig. 4)

#### Uncertainty Quantification 1. Definition of the input uncertainties – Frequency (F)

- Safety factors to take into account "limited knowledge" on transition;
- Success of the mission guaranteed at the expense of the mass/payload;

### State of the art

### **How Transition is now studied and predicted?**

- **Experiments : correlation and empirical transition criteria successfully used** in design *but* expensive, limited operating times and conditions are not those of real flight;
- **CFD** : simulations of real operating conditions *but* lack of reliable transitional models for high Mach number (*M*>5), *DNS* expensive for design;
- Flight tests : very expensive, unfeasible for design;

## **Objectives**

### What is our goal?

- Uncertainty Quantification (UQ) to characterize the impact of "limited knowledge" and to establish "error bars" on quantity of interest, such as the heat flux;
- define margins for more confidence and less conservative design;
- determine uncertainties on free stream conditions (Mach number, Pressure, **Temperature)** or related to the geometry (surface irregularities, leading edge shape);

- Figure 4 : Transfer function on a Mach 6 flat plate (Re = 4MiL)
- **2.** Definition of the input uncertainties :
- Frequency and propagation angle spectra : *pdf* with normal distribution (Fig. 5)

#### **Uncertainty Quantification**

2. Sampling procedure- Monte Carlo Sampling on stochastic collocatior



Figure 6 : Sampling procedure on the physical space according to input *pdf* 

### 4. Evaluation of the QI :

- the *pdf* of the output quantity of interest (N factor) is computed at each station of the domain (Fig. 7)

#### Uncertainty Quantification





#### 3. Monte Carlo sampling :

- each sample on the stochastic collocation space is related to the N factor according to the transfer function  $N=N(F,\psi)$  (Fig. 6)

#### Uncertainty Quantification





Figure 7 : *pdf* of the QI (N factor) at Re\_x = 4 MiL

#### **5.** Transition Prediction:

## **Strategy & Methods**

#### What is Uncertainty Quantification?

- a probabilistic approach to simulate a system by taking into account all uncertainties on boundary, initial conditions and model parameters;
- uncertainties modeled with probabilistic distributions according to the expected values or experimentally based;
- propagation of the uncertainties to study the impact on the *Quantity of Interest (QI)* of the simulation (heat flux, skin friction distribution);



Figure 3 : Flow chart of the strategy proposed for the transition prediction



Figure 8 : Application of the trasition criteria on the N factor) at Re\_x = 4 MiL

- 6. Evaluation of probability of transition at each station and comparison with experimental results (heat flux distribution) (Fig. 9)
- possible interpretation of the probability as the intermittency factor  $(\mathbf{x})$

- the cdf defines the probability of exceeding the threshold value for experimental transition (3.8 for the test case in [3]) at each station (Fig. 8)



Figure 8 : Comparison between experimental data (red dots), RANS solver (Black line) and computed probability of transition (blue dots) for the Mach 6 flat plate test case [3]

### Planning

- 1<sup>st</sup> year : Application of the methodology to experimental test cases (Flat Plate, Cone) with LST and RANS deterministic simulations;
- 1<sup>st</sup> & 2<sup>nd</sup> year : Inverse methodology to determine input uncertainties (probabilistic distributions) from experimental results;
- 3<sup>rd</sup> year : Improvement of understanding of transition mechanisms (DNS);
- 4<sup>th</sup> year : Calibration & Validation of the approach with experiments and flight

#### What is the Strategy?

- **1.** Deterministic Simulations (LST/RANS) : case dependent random parameters (Frequency, propagation angle, leading edge radius) representing the input uncertainties;
- 2. Evaluation of the QI : i.e. rising of heat flux/skin friction distribution for the transition onset;
- 3. Relation QI = QI (Input Parameters) : Transfer Function (TF) to relate Input/Output;
- 4. UQ analysis : Monte Carlo, Polynomial Chaos samplings on the physical space to obtain the related QI via the TF;
- 5. Definition of *"error bars"* and uncertainty on the QI;
- 6. Investigation through DNS of relevant cases;
- 7. Calibration & Validation : experiments and flight data;



### References

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