

# MODEL REDUCTION by using INVARIANT GRIDS

### Eliodoro Chiavazzo\*, Alexander N. Gorban\*\*, Iliya V. Karlin\*

\*Institute of Energy Technology, LAV-ETH Zuerich, Switzerland. \*\*Department of Mathematics, University of Leicester, Leicester UK.

*Roma*, 04-09-07



### **OUTLINE**

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- 6. QUASI-EQUILIBRIUM GRID APPROXIMATION
- 7. GRID PARAMETERIZATION AND TIME INTEGRATION
- 8. INITIAL CONDITION ISSUE
- 9. CONCLUSIONS



### **MODELING COMPLEXITY: notations...**

**<u>EXAMPLE</u>**: N SPECIES  $(A_1, ..., A_N)$  AND L ELEMENTS  $(E_1, ..., E_I)$  IN A CLOSED SYSTEM.



# REPRESENTATION BY MEANS OF THE STOICHIOMETRIC MECHANISM (*r* STEPS):

 $\alpha_{s1}A_1 + \dots + \alpha_{sN}A_N \Leftrightarrow \beta_{s1}A_1 + \dots + \beta_{sN}A_N, \quad s = 1, \dots, r$ 

NUMBER OF MOLECULES (SPECIES  $A_i$ , VOLUME V):  $n_{A_i}$ CONCENTRATION OF SPECIES  $A_i$ :  $c_i = \frac{n_{A_i}}{V}$ CONCENTRATION VECTOR:  $\vec{c} = \begin{bmatrix} c_1, \dots, c_N \end{bmatrix}$ 

#### THE EQUATIONS FOR MODELING:

$$\begin{cases} \vec{c} = \vec{f} = \sum_{i=1}^{r} \left( \vec{\beta}_{s} - \vec{\alpha}_{s} \right) \left[ k_{s}^{+} \prod_{j=1}^{N} c_{j}^{\alpha_{j}} - k_{s}^{-} \prod_{j=1}^{N} c_{j}^{\beta_{j}} \right] \\ \left( \vec{d}_{i}, \vec{c} \right) = const, \quad i = 1, \dots, L \\ \vec{\alpha}_{s} = \left[ \alpha_{s1}, \dots, \alpha_{sN} \right], \quad \vec{\beta}_{s} = \left[ \beta_{s1}, \dots, \beta_{sN} \right] \end{cases}$$

IN SOME RELEVANT CASES :

• DIFFERENT ORDER OF MAGNITUDE FOR  $k_s^{\pm}$  (*STIFF SYSTEMS*!!!)

• N IS A BIG NUMBER (*COMPLEXITY!!!*)



# THE PHASE-SPACE GEOMETRY...for stiff systems





## SYSTEM FEATURES

- CLOSED SYSTEM;
- ONE EQUILIBRIUM POINT;

• PURE DISSIPATIVE SYSTEM: A CONVEX LYAPUNOV FUNCTION "G" SUPPORTS THE SYSTEM.  $\frac{d\vec{c}}{dt} = \vec{f}, \quad \dot{G} = \left(\nabla G, \vec{f}\right) \le 0$ 



NEW SCALAR PRODUCT AND METRICS:

$$H = \frac{\partial^2 G}{\partial c_i \partial c_j}, \quad \left\langle \vec{x}, \vec{y} \right\rangle = \left( \vec{x}, H \vec{y} \right), \quad \left\| \vec{x} \right\| = \left\langle \vec{x}, \vec{x} \right\rangle$$





# THE INVARIANCE EQUATION

THE INVARIANCE REQUIREMENT FOR THE MANIFOLD  $\ \Omega$ 

$$\vec{c}(t_0) \in \Omega \Longrightarrow \vec{c}(t) \in \Omega, \quad \forall t \ge t_0$$

INTRODUCE A *PROJECTOR* OPERATOR ONTO THE *TANGENT SPACE* OF THE MANIFOLD  $P_c$ 

$$P_c\left(P_c\vec{f}\right) = P_c\vec{f}$$



AN INVARIANT MANIFOLD FULFILLS THE *INVARIANCE EQUATION*: NO *INVARIANCE DEFECT* IN ANY POINT.

$$\vec{f} - P_c \vec{f} = 0, \quad \forall c \in \Omega$$

$$\Delta = \vec{f} - P_c \vec{f}$$



# **THERMODYNAMIC PROJECTOR**

THE INVARIANCE EQUATION IS VALID FOR DIFFERENT CHOICES OF " $P_c$ " (Only one requirement:  $im(P_c) = tangent space$ .), but...

FOR DISSIPATIVE CLOSED SYSTEMS, THE THERMODYNAMIC CONSISTENCY REQUIRES THAT ENTROPY (-G) GROWS MONOTONICALLY FROM THE INITIAL CONDITION TO EQUILIBRIUM:

$$(\nabla G, PJ(c)) \leq 0, \quad \forall c \in \Omega$$

**Ref.: A.N. Gorban, I.V.Karlin**, Invariant Manifolds for Physical and Chemical Kinetics, Lect. Notes Phys. 660 (Springer Berlin Heidelberg 2005)

$$\begin{cases} P_c \vec{x} = P_0 \vec{x} + (\nabla G, \vec{x}) \vec{e}, & \vec{e} \in T_\Omega \\ T_{0\Omega} = T_\Omega \cap \ker \nabla G, & \langle \vec{e}, \vec{y} \rangle = 0, & \forall \vec{y} \in T_{0\Omega} \\ (\nabla G, \vec{e}) = 1, & P_0 \text{ orth. proj. to } T_{0\Omega} \end{cases}$$



# WHY THE THERMODYNAMIC PROJECTOR?







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# THE METHOD of INVARIANT GRID (MIG)

#### 1) INTRODUCE A NEW OBJECT: *THE INITIAL GRID*



3) CORRECT THE PREVIOUS GRID SO THAT:  $\Delta(c + \delta c) < \Delta(c)$ 

CORRECTIONS CAN BE FOUND BY SOLVING THE (INCOMPLETE) LINEARIZED INVARIANCE EQUATION

EXTRA CONDITION

$$\left\{ \begin{bmatrix} 1 - P_c \end{bmatrix} \begin{bmatrix} \vec{f} + J(c)\delta c \end{bmatrix} = 0, \quad J = \begin{bmatrix} \frac{\partial f_i}{\partial c_j} \end{bmatrix} \right\}$$

 $P_c \delta c = 0$  Hypothetic fast direction!



# THE METHOD of INVARIANT GRID (MIG)

#### TWO POSSIBLE PROCEDURES TO FIND CORRECTIONS

1) THE NEWTON METHOD WITH INCOMPLETE LINEARIZATION:

$$\begin{cases} \left[1-P_{c}\right]\left[\vec{f}+J(c)\delta c\right]=0, \quad J=\left[\frac{\partial f_{i}}{\partial c_{j}}\right] \\ P_{c}\delta c=0 \quad \text{HYPOTHETIC FAST DIRECTION!} \end{cases}$$



2) THE RELAXATION METHOD:

$$\delta c = \tau \cdot \Delta, \quad \tau = -\frac{\left\langle \Delta, \Delta \right\rangle}{\left\langle \Delta, J \Delta \right\rangle}$$

**Ref.: A.N. Gorban, I.V.Karlin, A. Y. Zinovyev**, Invariant grids for reaction kinetics, Physica A 333 106-154 (2004).





# **MIG INITIALIZATION**

#### A REASONABLE SLOW MANIFOLD APPROXIMATION IS GIVEN BY THE *Quasi Equilibrium Manifold* (*QEM*)





# **QUASI EQUILIBRIUM GRID ALGORITHM**

THE SQEM ANALITICAL CONSTRUCTION MAY GET MASSIVE FOR BIG SYSTEMS!!!

#### **EXAMPLE:** TWO-STEP FOUR COMPONENT REACTION

$$\begin{cases} A_{1} + A_{2} \Leftrightarrow A_{3} \Leftrightarrow A_{2} + A_{4} \\ c_{A_{1}}^{eq} = 0.5; c_{A_{2}}^{eq} = 0.1; c_{A_{3}}^{eq} = 0.1; c_{A_{4}}^{eq} = 0.4 \\ \downarrow \quad WRITE MINIMIZATION PROBLEM \end{cases}$$

$$\begin{cases} G = \sum_{i=1}^{4} c_{Ai} \left[ \ln \left( \frac{c_{Ai}}{c_{Ai}^{eq}} \right) - 1 \right] \rightarrow \min \right. \\ c_{A_{1}} + c_{A_{3}} + c_{A_{4}} = 1 \\ c_{A_{2}} + c_{A_{3}} = 0.2 \\ c_{A_{1}} - 1.25c_{A_{4}} = \xi \end{cases}$$

$$\downarrow \quad APPLY LAGRANGE MULTIPLIERS METHOD$$

$$\frac{\xi + 1.25c_{A_{4}}}{c_{A_{1}}^{eq}} \right)^{1.25} \left( \frac{c_{A_{3}}^{eq} \xi + 2.25c_{A_{4}} - 0.8}{c_{A_{2}}^{eq} - \xi - 2.25c_{A_{4}} + 1} \right)^{2.25} \frac{c_{A_{4}}}{c_{A_{4}}^{eq}} - 1 = 0$$

#### <u>ALTERNATIVELY:</u> CONSTRUCT A DISCRETE ANALOG



THE <u>QUASI-EQUILIBRIUM ALGORITHM</u> IS AN AUTOMATIC PROCEDURE THAT PROVIDES A SET OF NODES CLOSE TO THE QEM.

THE QE-GRID IS CHARACTERIZED BY THE PARAMETER:

$$\varepsilon = \left| c_{n+1} - c_n \right| = \left| \vec{\delta} c \right|$$

SOLVE AND GET THE SQEM!!!

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**QE-MANIFOLD VS QE-GRID** 





# **QEG-ALGORITHM:** some more examples

HYDROGEN OXIDATION: SIX-STEP SIX-COMPONENT REACTION. CLOSED SYSTEM (V,T=const)





# LI, ZHAO, KAZAKOV, DRYER MECHANISM





# **QEG-ALGORITHM WITHOUT ENTROPY**



THE IDEA: THE MAGNITUDE OF THE VECTOR FIELD DECAYS ALONG THE FAST MOTIONS...



# **A POSTERIORI PARAMETERIZATION**

AVAILABLE INFO AFTER THE REFINEMENT PROCEDURE:

- 1) A SET OF NODES IN THE PHASE-SPACE
- 2) APPROXIMATE TANGENT SPACE AT THE GRID NODES
- 3) THERMODYNAMIC PROJECTOR  $P_c$





INVARIANT GRID (M-dimensional) TRAJECTORY  $c^* + \ker(P_c)$ 

CHOOSE *M* SLOW VECTORS:  $\vec{m}^i = \begin{bmatrix} m_1^i, \dots, m_N^i \end{bmatrix}$ 

INTRODUCE M NEW VARIABLES:

$$\xi^{i} = \sum_{j=1}^{N} m_{j}^{i} c_{j}, \quad \forall i = 1, \dots, M$$

$$\begin{bmatrix} \dot{\xi}^{1} \\ \vdots \\ \dot{\xi}^{M} \end{bmatrix} = \begin{bmatrix} \sum_{j=1}^{N} m_{j}^{1} \left( P_{c} \vec{f} \right)_{j} \\ \vdots \\ \sum_{j=1}^{N} m_{j}^{M} \left( P_{c} \vec{f} \right)_{j} \end{bmatrix} = RHS(c_{1}, \dots, c_{N}) \longrightarrow \begin{bmatrix} c_{1} \\ \vdots \\ c_{N} \end{bmatrix} \Leftrightarrow L.U.T. \Leftrightarrow \begin{bmatrix} \xi^{1} \\ \vdots \\ \xi^{M} \end{bmatrix}$$

A LINK BETWEEN REDUCED VARIABLES AND PRIMITIVE ONES CAN BE ESTABLISHED VIA *L.U.T*..

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# LAV

### WHEN DOES IT WORK?



#### THE MAPPING NEEDS TO BE *UNIQUE* AND HAS TO DO WITH THE PARAMETERIZATION VECTOR: $\vec{m}$

A REASONABLE WAY TO CHOOSE THAT VECTORS IS GIVEN BY THE SQEM PARAMETERIZATION:

$$\left\{\vec{m}_{SQEG}^{1},\ldots,\vec{m}_{SQEG}^{M}\right\}$$
  $\longrightarrow$  THE *M* SLOWEST LEFT EIGENVECTORS OF JACOBIAN AT THE EQUILIBRIUM POINT



# **INTEGRATION ON A 1D GRID**





### **INTEGRATION ON A 2D GRID**





# **INITIAL CONDITION ISSUE**

$$\begin{cases} \frac{d\vec{c}}{dt} = \vec{f} \\ \vec{c} \left( t_0 \right) = \vec{c}_0 \end{cases} \Rightarrow \begin{cases} \frac{d\vec{\xi}}{dt} = \left( \vec{m}, P_c \vec{f} \right) \\ \vec{\xi}_0 = ? \end{cases}$$

THE INITIAL CONDITION, IN THE REDUCED SYSTEM, CAN BE FOUND BY EXPLOITING THE THERMODYNAMIC PROJECTOR:



**EXAMPLE:** FOUR-STEP THREE-COMPONENT REACTION. CLOSED SYSTEM (V,T=*const*):

TAKE A GRID NODE:

 $c^* = [0.375, 0.168, 0.457]$ 

THE FAST AFFINE SUBSPACE IS:

$$c_0 = c^* + \alpha \vec{g}_1(c^*) \quad \vec{g}_1 \equiv \ker P_c$$





# FINDING REDUCED INITIAL CONDITIONS







# **CONCLUSIONS**

- 1. THE INVARIANT GRID APPROXIMATION WAS USED IN ORDER TO DESCRIBE THE INVARIANT MANIFOLD (SLOW SUBSPACE) FOR DISSIPATIVE SYSTEM (WITH LYAPUNOV FUNCTION).
- 2. THE FAST SUBSPACE IS CONSTRUCTED VIA THERMODYNAMIC PROJECTOR, ONCE THE REFINEMENT PROCEDURE (MIG) IS TERMINATED.
- 3. THE QUASI-EQUILIBRIUM ALGORITHM REVEALS TO BE A USEFUL TOOL IN CONSTRUCTING AN APPROXIMATE INVARIANT GRID AND INITIALIZE THE REFINEMENT PROCEDURE.
- 4. AN "A POSTERIORI" PARAMETERIZATION ALLOWS TO EXPLOIT THE INVARIANT GRID IN ORDER TO INTEGRATE THE REDUCED SYSTEM.
- 5. THE INITIAL CONDITION IN THE REDUCED SYSTEM CAN BE FOUND BY USING THE FEATURE OF THE THERMODYNAMIC PROJECTOR.



# **ACKNOWLEDGEMENTS**

- PROF. K. BOULOUCHOS
- DR. C. FROUZAKIS
- SWISS NATIONAL SCIENCE FOUNDATION (SNF)
- SWISS FEDERAL OFFICE OF ENERGY (BFE)

# **THANKS FOR YOUR ATTENTION!!!**