

Model Reduction for CFD Models



General Model Reduction Problem

Given a dynamical system

$$\Sigma = (f,h) : \begin{cases} \dot{x} &= f(x(t), u(t)) \\ y(t) &= h(x(t), u(t)) \end{cases}$$

where

- $u(t) \in \mathbb{R}^i$ is the *input* function
- $y(t) \in \mathbb{R}^{o}$ is the *output* function
- $x(t) \in \mathbb{R}^n$ is the *state* of the system

approximate the system Σ (of order *n*) with a system

 $\hat{\Sigma} = (\hat{f}, \hat{h})$

of *lower order* $k \ll n$, where $u(t) \in \mathbb{R}^i$, $\hat{y}(t) \in \mathbb{R}^o$ and $\hat{x}(t) \in \mathbb{R}^k$.



A pictorial representation of MR, by B. Lohmann, B. Salimbahrami and A. Yousefi.



Flapping wing propulsion can be described by Navier-Stokes equations

Model Reduction Methods

A classification from Antoulas and Sorensen^a divides the MR methods in

- SVD-based methods
 - for non-linear systems: POD, Empirical grammians
 - for linear systems: balanced truncation, Hankel approximation
- Krylov-base methods: realization, interpolation, Lanczos, Arnoldi
- SVD-Krylov base methods

SVD	Krylov
- $O(n^3)$ operations	+ $O(k^2n)$ operations
- factorizations	 + only matrix-vector multiplications
+ global error estimators	 no global error estima- tor
+ preserve stability	 no guarantee for stabi- lity

The third class contains methods that combines the best feature of the first two classes. They represent an actual topic of research.

^aA. Antoulas - Approximation of Large-Scale Dynamical Systems SIAM, 2005

CFD Model

The governing equations are

$$\frac{d}{dt}\int_{V}wdV + \int_{S}(F^{c} - F^{v})ndS - \int_{S}(wv_{b})ndS + \int_{V}gdV = 0$$
(1)

where

- *w* is the vector of conservative variables $w = (\rho, \rho v, \rho E)^T$
- F^c and F^v are the convective and viscous fluxes

$$F^{c} = \begin{pmatrix} \rho v \\ \rho v v^{T} + pI \\ \rho E v + pv \end{pmatrix}, F^{v} = \begin{pmatrix} 0 \\ T \\ T v - q \end{pmatrix}$$

• *g* is the additional source term $g = (0, \rho \dot{\phi} \times v, 0)^T$

The first two integrals in (1) are the same as in the Navier-Stokes equations for fixed control volumes. The third integral results from the deformation of the control volumes in the fixed Cartesian coordinate system, with v_b as the velocity vector of the moving cell boundaries. The fourth integral is generated in the transformation from the fixed to the moving coordinate system. (See M.F.Neef - *Analyse des Schlagflugs durch numerische Strömungsberechnung*, Dissertation TU Braunschweig, 2002)

Finite Volume Method will be used to discretize the PDEs. Different method for generating reduced-order model will be considered and compared concerning computational efficiency and errors in the model.