



MAX PLANCK INSTITUTE
FOR DYNAMICS OF COMPLEX
TECHNICAL SYSTEMS
MAGDEBURG



COMPUTATIONAL METHODS IN
SYSTEMS AND CONTROL THEORY

Model Order Reduction for Gas and Energy Networks

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N. Banagaaya, P. Benner, S. Grundel, C. Himpe

Simulation of Energy Systems Team (SES)
Computational System and Control Theory Group (CSC)
Max Planck Institute Magdeburg (MPI MD)

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Outline

1. Design Principles
2. morgen Framework
3. Outlook

- Test, benchmark and compare
- data-driven (time-domain)
- model reduction techniques
- for (nonlinear) gas networks
- modularly and configurably.
- OCTAVE & MATLAB compatible.

¹Model Order Reduction for Gas and Energy Networks



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Modules

- Models
- Solvers
- Decouplers
- Reductors
- Networks & Scenarios
- Other

- Friction²
- Compressibility³ (WIP)
- Gravity⁴ (WIP)
- Linearized⁴ (WIP)
- Descriptor
- Herty Approximation⁴

² S. Grundel, L. Jansen, N. Hornung, T. Clees, C. Tischendorf, and P. Benner. **Model order reduction of differential algebraic equations arising from the simulation of gas transport networks.** In Progress in Differential-Algebraic Equations, Differential-Algebraic Equations Forum, pages 183–205. Springer Berlin Heidelberg, 2014.

³ S. Grundel, N. Hornung, and S. Roggendorf. **Numerical aspects of model order reduction for gas transportation networks.** In S. Koziel, L. Leifsson, and X.-S. Yang, editors, Simulation-Driven Modeling and Optimization, pages 1–28. Springer, 2016.

⁴ M. Herty, J. Mohring and V. Sachers. **A new model for gas flow in pipe networks.** Mathematical Methods in the Applied Sciences 33(7): 845–855, 2010.

- IMEX-1⁵ (First Order Implicit-Explicit Runge-Kutta)
- IMEX-2⁶ (Second Order Implicit-Explicit Runge-Kutta)
 - Implicit: Passive Runge-Kutta⁷ (DIRK-2)
 - Explicit: Strong Stability Preserving Runge-Kutta⁸ (SSP-2)
- Generic
 - MATLAB: ode15s⁹
 - OCTAVE: ode2r¹⁰

⁵ S. Grundel and L. Jansen. Efficient simulation of transient gas networks using IMEX integration schemes and MOR methods. In 54th IEEE Conference on Decision and Control (CDC), Osaka, Japan, pages 4579–4584, December 2015.

⁶ L. Pareschi and G. Russo. Implicit-Explicit Runge-Kutta Schemes and Applications to Hyperbolic Systems with Relaxation. Journal of Scientific Computing 25(1): 129–155, 2005.

⁷ D. Franken and K. Ochs. Numerical stability properties of passive Runge-Kutta methods. The 2001 IEEE International Symposium on Circuits and Systems III: 473–476, 2001.

⁸ D.I. Ketcheson. Highly Efficient Strong Stability-Preserving RungeKutta Methods with Low-Storage Implementations. SIAM Journal on Scientific Computing 30(4): 2113–2136, 2008.

⁹ <https://mathworks.com/help/matlab/ref/ode15s.html>

¹⁰ <https://octave.sourceforge.io/odepkg/function/ode2r.html>



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Decouplers

- Linear(ized)¹¹
- Quadratic¹² (WIP)
- Generic Nonlinear (WIP)

¹¹ G. Ali, N. Banagaaya, W.H.A. Schilders, and C. Tischendorf **Index-Aware Model Order Reduction for Linear Index-2 DAEs with Constant Coefficients**. SIAM Journal on Scientific Computing 35(3): A1487–A1510, 2013.

¹² N. Banagaaya, P. Benner, L. Feng, P. Meuris, and W. Schoenmaker. **An index-aware parametric model order reduction method for parameterized quadratic differential-algebraic equations**. Applied Mathematics and Computation, In Press:1–16, 2017.

In structured and unstructured variants:

- Proper Orthogonal Decomposition¹³ (POD)
- Dynamic Mode Decomposition¹⁴ (DMD-Galerkin)
- Empirical Balanced Truncation¹⁵
- Empirical Cross Gramian¹⁶ (*)
- Empirical Non-Symmetric Cross Gramian¹⁷

¹³ P. Holmes, J.L. Lumley, G. Berkooz, and C.W. Rowley. **Turbulence, coherent structures, dynamical systems and symmetry**. Cambridge Monographs on Mechanics. Cambridge University Press, Cambridge, 2012.

¹⁴ A. Alla and J.N. Kutz. **Nonlinear model order reduction via dynamic model decomposition**. arXiv e-print 1602.05080, Cornell University, 2016. math.NA.

¹⁵ S. Lall, J.E. Marsden, and S. Glavaški. **Empirical model reduction of controlled nonlinear systems**. In Proc. of the IFAC World Congress, volume F, pages 473–478, 1999.

¹⁶ C.H. and M. Ohlberger. **Cross-Gramian based combined state and parameter reduction for large-scale control systems**. Mathematical Problems in Engineering, 2014(Article ID 843869):113, 2014.

¹⁷ C.H. and M. Ohlberger. **A note on the cross Gramian for non-symmetric systems**. Systems Science and Control Engineering, 4(1):199–208, 2016.

- Procedural pipeline
- Forked network
- Diamond network
- AzeJ07¹⁸ (WIP)
- GruHKetal13¹⁹
- GruHJetal14²⁰
- GruHR16⁴ (WIP)
- GasLib-582²¹ (WIP)

¹⁸ T.P. Azevedo-Perdicoulis and G. Jank. **Modelling Aspects of Describing a Gas Network Through a DAE System**. In IFAC Proceedings Volumes 40(20): 40–45, 2007.

¹⁹ S. Grundel, N. Hornung, B. Klaassen, P. Benner, and T. Clees. **Computing surrogates for gas network simulation using model order reduction**. In S. Koziel and L. Leifsson, editors, Surrogate-Based Modeling and Optimization, pages 189–212. Springer, New York, 2013.

²⁰ S. Grundel, L. Jansen, N. Hornung, T. Clees, C. Tischendorf, and P. Benner. **Model order reduction of differential algebraic equations arising from the simulation of gas transport networks**. In Progress in Differential-Algebraic Equations, Differential-Algebraic Equations Forum, pages 183–205. Springer Berlin Heidelberg, 2014.

²¹ <http://gaslib.zib.de>



- Tests for verification and validation
- Plain text intermediary formats:
 - Network (csv)
 - Scenario (ini)
- Configuration:
 - Friction formula
 - Compressibility formula
 - etc.
- Utility library



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Upcoming

- json network parser
- Alternative Discretizations
- More networks:
 - External compressors¹⁸
 - Internal compressors (????)
- More data-driven MOR methods:
 - balanced POD²² (bPOD)
 - input-output DMD²³ (ioDMD)
- Visualization

²²C. W. Rowley. Model reduction for fluids, using balanced proper orthogonal decomposition. *Int. J. Bifurcat. Chaos*, 15(3): 997–1013, 2005.

²³J. Annoni, P. Gebräad, and P. Seiler. Wind farm flow modeling using input-output dynamic mode decomposition. In American Control Conference (ACC), pages 506–512, 2016.



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Overall

- Basic functionality is ready.
- Advanced features in development.
- Reusability is essential.

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