



## MaRDI TA2: Research Data and Reproducibility in Scientific Computing

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Computational Reproducibility Seminar of the Swiss Reproducibility Network  
November 15, 2023

## Outline

Scientific computing within MaRDI

M 2.3 — MaRDIMark

Model Order Reduction Wiki (MORWiki)

Model Order Reduction Benchmarker (MORB)

Analyzing a Collection of Collections (MathBench)



## Outline

Scientific computing within MaRDI

MaRDI — THE Mathematical Research Data Initiative

Overview of Task Area 2 (TA2)

M 2.3 — MaRDIMark

Model Order Reduction Wiki (MORWiki)

Model Order Reduction Benchmarker (MORB)

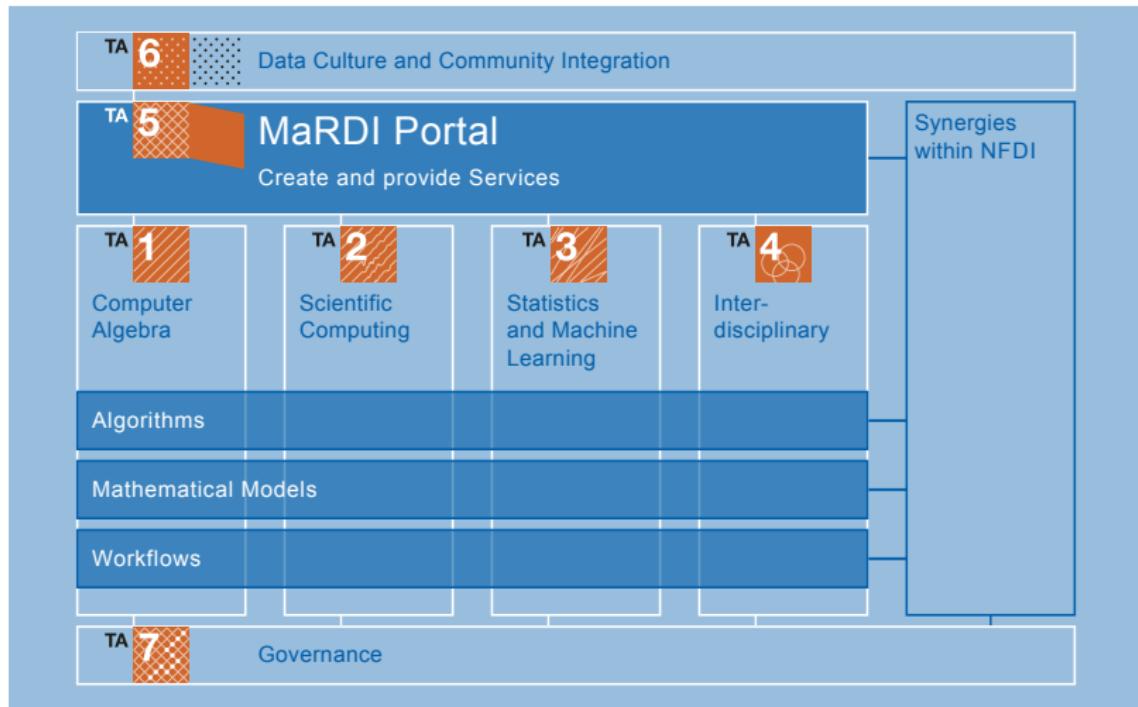
Analyzing a Collection of Collections (MathBench)

# MaRDI — THE Mathematical Research Data Initiative

- ▶ 1 out of 27 NFDI consortia
- ▶ the one consortium of mathematics
- ▶ 16 institutions and partners
- ▶ kick-off November 2021
- ▶ 28 (full-time equivalent) employees
- ▶ funding over a period of five years

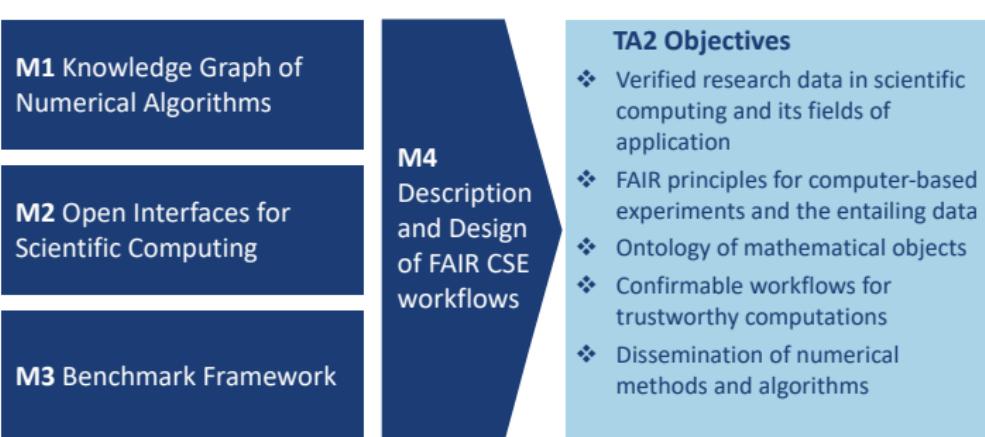
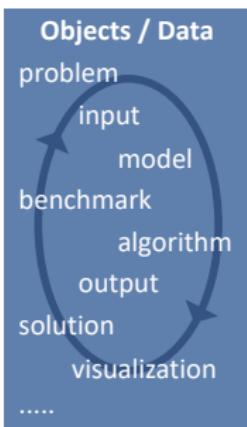


## TA2 within MaRDI

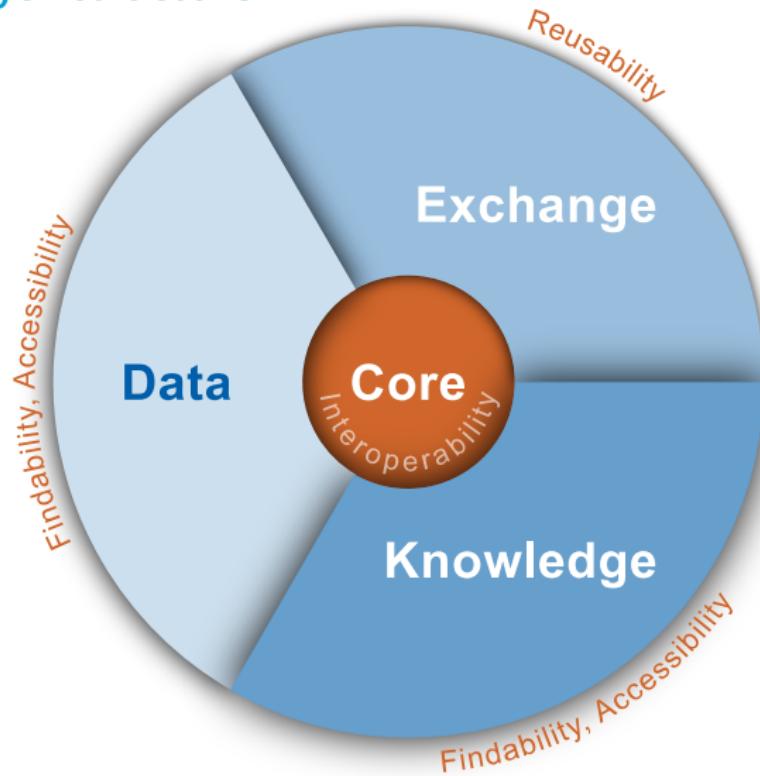




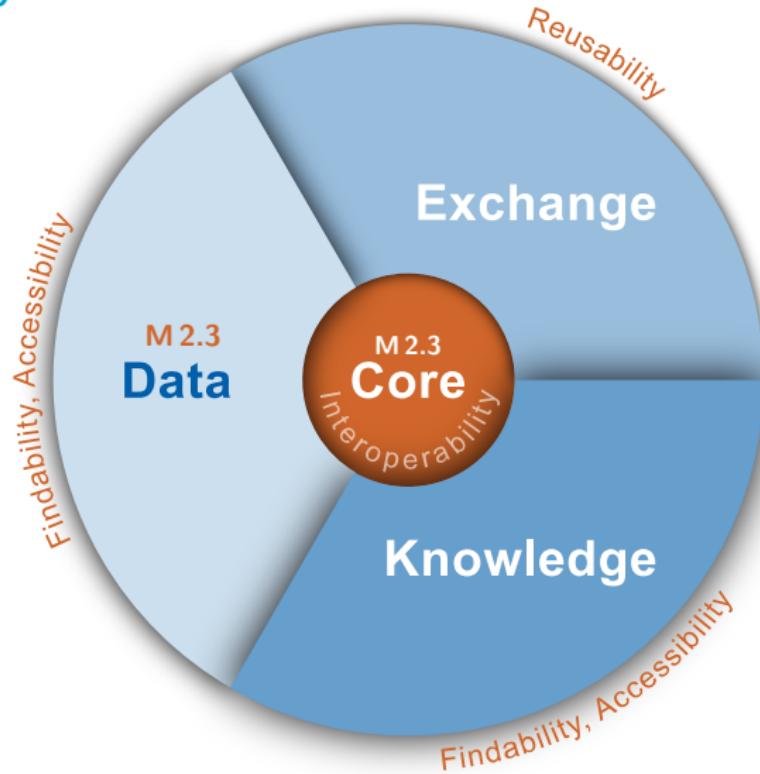
## MaRDI Task Area 2: Measures and major objectives



## MaRDI Layer structure



## MaRDI Layer structure





## Interplay with other Consortia

case studies with other disciplines



## Outline

Scientific computing within MaRDI

M 2.3 — MaRDIMark

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## M 2.3 — MaRDIMark

A general-purpose benchmarking framework for comparing implementations of algorithms using problems native to a community

### Aims:

- ▶ Generic, extensible toolkit
- ▶ Language-agnostic interoperability
- ▶ Fair comparison among different implementations of algorithms  
(e.g., from different libraries, packages, toolboxes, etc.)
- ▶ Flexible (community-driven) performance measures



## M 2.3 — MaRDIMark

### Main Elements

Problems	Methods	Driver	Analysis	Explorer
data, metadata	code, executable, metadata	interfaces, parameters	performance measures	distillation, result browser
X2: Data	X2: Data	X1: Core	X2: Data	X4: Knowledge

### Tasks

- ▶ Assembly of domain-independent specifications
- ▶ Database of curated benchmarks
- ▶ Result data (schemes, amounts, formats, raw or analyzed?)
- ▶ Classification, visualization?

### Connections

- ▶ Uses knowledge graph (M 2.1)
- ▶ Uses open interfaces (M 2.2)
- ▶ Uses confirmable workflows (M 2.4)
- ▶ Has high synergetic potential (TA3)
- ▶ Integrates into MaRDI Portal (TA5)



## M 2.3 — MaRDIMark

### Main Elements

<b>Problems</b>  data, metadata  X2: Data	<b>Methods</b>  code, executable, metadata  X2: Data	<b>Driver</b>  interfaces, parameters  X1: Core	<b>Analysis</b>  performance measures  X2: Data	<b>Explorer</b>  distillation, result browser  X4: Knowledge
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### Tasks

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## M 2.3 — MaRDIMark

### Main Elements

#### Problems

data,  
metadata

X2: Data

#### Methods

code,  
executable,  
metadata

X2: Data

#### Driver

interfaces,  
parameters

X1: Core

#### Analysis

performance  
measures

X2: Data

#### Explorer

distillation,  
result browser

X4: Knowledge

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Scientific computing within MaRDI

M 2.3 — MaRDIMark

Model Order Reduction Wiki (MORWiki)

A community platform as a prototype for a curated benchmark collection

Tasks and challenges

Model Order Reduction Benchmarker (MORB)

Analyzing a Collection of Collections (MathBench)



# Model Order Reduction Wiki (MORWiki)

A community platform as a prototype for a curated benchmark collection

The screenshot shows the homepage of the MOR Wiki. At the top, there is a search bar, a user icon, and a dropdown menu. The main header says "MOR Wiki". Below it, there are tabs for "MOR Wiki", "COMMUNITY", and "EXPLORE". The sidebar on the left has sections for "Main page", "Benchmarks", "Methods", "Software", "Publications", and "Submission Rules". The "Submission Rules" section contains links to "1 Introduction to the MOR Wiki", "1.2 MORB: Model Order Reduction Benchmarking", and "1.3 Citations". It also has a link to "2 List of all Categories in the Wiki". The main content area starts with an "Introduction" section. The text in this section explains the purpose of the wiki and the underlying modeling and simulation process.

The purpose of the **Model-Order-Reduction-Wiki** is to bring together experts in the area of model reduction along with researchers from related application areas, with the goal of providing a platform for exchanging ideas and benchmark examples.

Modeling and numerical simulation are unavoidable in many application and research areas such as reaction processes, micro-electro-mechanical systems (**MEMS**) design, and control design. Such processes or devices can be modeled by partial differential equations (**PDEs**). To simulate these models, spatial discretization via, for example, finite element discretization is necessary, which results in a system of ordinary differential equations (**ODEs**), or differential algebraic equations (**DAEs**).

After spatial discretization, the number of degrees of freedom (**DoFs**) is usually very high. Simulating such large-scale systems of ODEs or DAEs can therefore become incredibly time-consuming. Developed from well established mathematical theory and robust numerical algorithms, Model Order Reduction (**MOR**) or Model Reduction has been recognized as very efficient for reducing the simulation time of large-scale systems; see the page [Projection based MOR](#) for a basic overview. Through model order reduction, a

<http://modelreduction.org>

# Model Order Reduction Wiki (MORWiki)

A community platform as a prototype for a curated benchmark collection

## Services provided

- ▶ Descriptions of basic MOR methods
- ▶ Collection of curated benchmark examples
- ▶ Description and comparison of available MOR software
- ▶ MOR literature aggregation and BibTeX data
- ▶ Compilation of community events

## Lessons learned

- ▶ Encourage community engagement via low contribution barrier:
  - ▶ Easy access
  - ▶ Simple formats
  - ▶ Small rule-sets
- ▶ Ensure content licensing and create proper citation culture
- ▶ Incentivize users for their contributions

# Model Order Reduction Wiki (MORWiki)

## Tasks and challenges

### Licensing

- ▶ Old benchmark models without licenses
  - ▶ SLICOT Collection collected 2002–2006
  - ▶ Oberwolfach Collection circa 2005
- ▶ Benchmark descriptions and illustrations in the wiki

### Assembling metadata

- ▶ Classic data properties (creators, editors, etc.)
- ▶ Mathematical properties of
  - ▶ the systems modeled by the benchmark data
  - ▶ the numerical data itself (e.g., matrix sparsity, symmetry, condition number, etc.)

## Outline

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Model Order Reduction Benchmarker (MORB)

MORB 0.1 — benchmarking stable LTI Systems in MATLAB

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# Model Order Reduction Benchmarker (MORB)

MORB 0.1 — benchmarking stable LTI Systems in MATLAB

## Linear Time-Invariant (LTI) System

$$\begin{aligned} E\dot{x}(t) &= Ax(t) + Bu(t), \\ y(t) &= Cx(t) + Du(t). \end{aligned} \qquad \Leftrightarrow \qquad H(s) = C(sE - A)^{-1}B$$

## Why so restrictive at the moment?

- ▶ Most MORWiki benchmarks are LTI or parametric LTI
- ▶ Most MOR software for LTI systems is written in MATLAB
- ▶ Simple proof-of-concept to get feedback on



# Model Order Reduction Benchmarker (MORB)

MORB 0.1 — benchmarking stable LTI Systems in MATLAB

## Challenges

- ▶ Ensuring all benchmark data is encoded uniformly (.mat, v7.3)
- ▶ Calling external software as “black boxes” and without unnecessary overhead
- ▶ Determining what counts as a unique implementation of an algorithm (“algorithm isotope”)
- ▶ Finding subroutines that compute measures (e.g., error, speed, etc.) efficiently and accurately



# Model Order Reduction Benchmarker (MORB)

MORB 0.1 — benchmarking stable LTI Systems in MATLAB

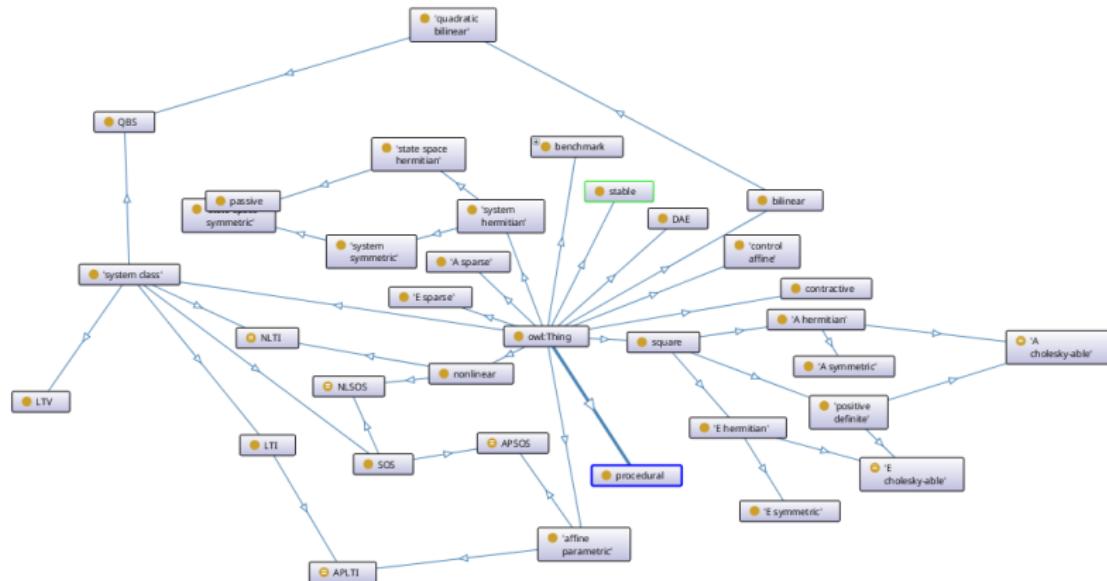
## Mostly completed tasks

- ▶ Automated computation of mathematical metadata
  - ▶ Still ongoing for large systems (symmetry, stability, passivity, contractivity, etc.)
- ▶ Database of benchmark-metadata
  - ▶ Interns (A. Stage and M. Speidel) worked on MORBO (MORB Ontology) and search interface
- ▶ Balanced Truncation (BT) algorithm isotopes for Control Systems Toolbox, M-M.E.S.S., MORLAB, and pyMOR

# Model Order Reduction Benchmarker (MORB)

MORB 0.1 — benchmarking stable LTI Systems in MATLAB

MORBO (MORB Ontology)





# Model Order Reduction Benchmarker (MORB)

## MORB 0.1 — benchmarking stable LTI Systems in MATLAB

MORB search tool / database

filename	MORWikiPageName	directory	MORWikiLink	nStates	nInputs	nOutputs	components	nParameters	systemClass	isDAE	diagDiffIndex	isSquare	isStateSpace	isSysSym	isPassive	isContractive	isStable	nUnstabPoles	isASym	isACholABl	isASparse	nnzA	condA	
linear1Dbeam_n14n1qf	Linear 1D Beam observerFach		<a href="#">https://morb.mwz.de</a>	14	1	1	B, C, E, K, M	0	LTI-SOS	0	0	1	0	1				NaN	NaN	NaN	NaN	NaN		
nonlinearHeatTransfer_n1f	Nonlinear Heat observerFach		<a href="#">https://morb.mwz.de</a>	15	2	2	A, B, C, E	0	LTI-FOS	0	0	1	0	0			0	15	1	1	43	4.80e+02		
nonlinearHeatTransfer_n1f	Nonlinear Heat observerFach		<a href="#">https://morb.mwz.de</a>	15	2	2	A, B, C, E, F, f	0	LTI-FOS			1	NaN	NaN				1	1	1	43	4.80e+02		
linear1Dbeam_n15n1qf	Linear 1D Beam observerFach		<a href="#">https://morb.mwz.de</a>	15	1	1	B, C, E, F, K, M, f	0	LTI-SOS			1	0	1				NaN	NaN	NaN	NaN	NaN		
electrostaticBeam_n38n1qf	Electrostatic Beam observerFach		<a href="#">https://morb.mwz.de</a>	38	1	1	B, C, E, F, K, M, f	0	LTI-SOS			1	NaN	NaN				NaN	NaN	NaN	NaN	NaN		
buildingModel_n48n1qf	Building Model sicut		<a href="#">https://morb.mwz.de</a>	48	1	1	A, B, C	0	LTI-FOS	0	0	1	0	1	0	0	1	0	0	0	1	1179	1.23e+04	
newEngland_n65n1qf	Power System power_system		<a href="#">https://morb.mwz.de</a>	65	1	1	A, B, C	0	LTI-FOS	0	0	1	0	1	0	0	1	0	0	0	0	0	3.03e+11	
connectionReaction_n84	Connection Reaktion sicut		<a href="#">https://morb.mwz.de</a>	84	1	1	A, B, C	0	LTI-FOS	0	0	1	0	1	0	0	0	1	0	0	1	382	7.36e+00	
onSommerfeld_n100n1qf	On-Sommerfeld sicut		<a href="#">https://morb.mwz.de</a>	100	1	1	A, B, C	0	LTI-FOS	0	0	1	0	1	0	0	1	0	0	0	1	10000	7.36e+02	
cfdPlayer_n120n1qf	CFD Player sicut		<a href="#">https://morb.mwz.de</a>	120	2	2	A, B, C	0	LTI-FOS	0	0	1	0	0	0	1	0	0	0	0	1	240	1.81e+04	
heatEquation_n200n1qf	Heat Equation sicut		<a href="#">https://morb.mwz.de</a>	200	1	1	A, B, C, E	0	LTI-FOS	0	0	1	0	1			0	4	1	0	1	586	6.51e+03	
rancor_n200n1qf	Rancor sicut		<a href="#">https://morb.mwz.de</a>	200	1	1	A, B, C	0	LTI-FOS	0	0	1	0	1	0	0	1	0	0	0	1	2132	3.00e+03	
transmissionLine_n250n1qf	Transmission Line sicut		<a href="#">https://morb.mwz.de</a>	250	2	2	A, B, C, E	0	LTI-FOS	0	1	0						1	1	0	0	0	226	2.22e+05
aa_n270n1qf	International 8j sicut		<a href="#">https://morb.mwz.de</a>	270	3	3	A, B, C	0	LTI-FOS	0	0	1	0	0	0	0	1	0	0	0	1	405	9.88e+03	
dcCircuitEq_n306n1qf	DC Circuit Eq observerFach		<a href="#">https://morb.mwz.de</a>	306	2	2	A, B, C, E	0	LTI-FOS	1	1	0					0	168	0	0	1	686	inf	
clampedBeam_n349n1qf	Clamped Beam sicut		<a href="#">https://morb.mwz.de</a>	349	1	1	A, B, C	0	LTI-FOS	0	0	1	0	1	0	0	1	0	0	0	1	60720	3.74e+07	
electrostaticBeam_n398n1qf	Electrostatic Beam observerFach		<a href="#">https://morb.mwz.de</a>	398	1	1	B, C, E, F, K, M, f	0	LTI-SOS			1	NaN	NaN				NaN	NaN	NaN	NaN	NaN		
nonlinearHeatTransfer_n410n1f	Nonlinear Heat observerFach		<a href="#">https://morb.mwz.de</a>	410	2	2	A, B, C, E, F, f	0	LTI-FOS			1	NaN	NaN				1	1	1	1	1228	3.00e+05	
peecModel_n480n1qf	PEEC Model (Yee) sicut		<a href="#">https://morb.mwz.de</a>	480	1	1	A, B, C, E	0	LTI-FOS	1	1	0					0	264	1	0	1	1348	1.85e+14	
ModularNodal.nod1	Modular Nodal sicut		<a href="#">https://morb.mwz.de</a>	578	9	9	A, B, C, E	0	LTI-FOS	1	1	0					0	290	0	0	1	1054	2.63e+08	
carMathematics_n569n1qf	Car Mathematics sicut		<a href="#">https://morb.mwz.de</a>	569	1	1	A, B, C, E	0	LTI-FOS	0	0	1	0	1	0	0	1	0	0	0	0	37456	1.90e+02	
rrra_n569n1qf	Modified Node sicut		<a href="#">https://morb.mwz.de</a>	569	4	4	A, B, C, E	0	LTI-FOS	1	1	0					0	258	0	0	1	2872	6.05e+07	
peruFCM_n1020n1qf	Peru FCM sicut		<a href="#">https://morb.mwz.de</a>	1020	1	1	A, B, C	0	LTI-FOS	0	0	1	0	1			0	258	0	0	1	1012	1.00e+03	
steelPlate_n1357n1qf	Steel Plate observerFach		<a href="#">https://morb.mwz.de</a>	1357	7	6	A, B, C, E	0	LTI-FOS	0	0	0	0	0			1	0	1	0	1	9985	2.25e+04	
aa_n1414n1qf	International 8j sicut		<a href="#">https://morb.mwz.de</a>	1414	3	3	A, B, C	0	LTI-FOS	0	0	1	0	0			1	0	0	0	0	2118	7.76e+01	
peakInductor_n1434n1qf	Peak Inductor observerFach		<a href="#">https://morb.mwz.de</a>	1434	1	1	A, B, C, E	0	LTI-FOS	0	0	1	0	1			1	0	1	0	1	10223	1.47e+05	
transmissionLine_n1600n1qf	Transmission Line sicut		<a href="#">https://morb.mwz.de</a>	1600	14	14	A, B, C, E	0	LTI-FOS	0	1	1	0	1			0	0	0	0	0	5280	inf	
tunableOpticalFilt_n1600n1qf	Tunable Optical filter sicut		<a href="#">https://morb.mwz.de</a>	1600	1	5	A, B, C, E	0	LTI-FOS	0	0	0	0	0			1	0	1	0	1	10750	7.23e+04	
dcCircuitEquation_n1641	DC Circuit Eq sicut		<a href="#">https://morb.mwz.de</a>	1641	16	16	A, B, C, E	0	LTI-FOS	1	1	0	1	1			0	945	0	0	1	5881	4.04e+02	
circularPiston_n2026n1qf	Circular Piston observerFach		<a href="#">https://morb.mwz.de</a>	2025	1	2025	B, C, E, K, M	0	LTI-SOS			0	0	0				NaN	NaN	NaN	NaN	NaN		
transmissionLine_n2624	Transmission Line sicut		<a href="#">https://morb.mwz.de</a>	2624	30	30	A, B, C, E	0	LTI-FOS	0	1	1	0	0			0	0	1	0	1	9540	inf	
thermalModel_n4257n1qf	Thermal Model observerFach		<a href="#">https://morb.mwz.de</a>	4257	1	7	A, B, C, E	0	APLTI-FOS	0	1	0	0	0			1	0	1	0	1	37465	2.52e+16	
microscopyTheta_n4257	Microscopy Theta observerFach		<a href="#">https://morb.mwz.de</a>	4257	1	7	A, B, C, E	0	LTI-FOS	0	0	0	0	0			1	0	1	0	1	37465	2.52e+16	



# Model Order Reduction Benchmarker (MORB)

MORB 0.1 — benchmarking stable LTI Systems in MATLAB

MORB test and algorithm configuration

```
2   "newEngland_n66m1q1":  
3     {  
4       "alg_iso":  
5         {  
6           "bt":  
7             {  
8               "cst":  
9                 [ [  
10                  "tol": 1E-6  
11                ),  
12                  [ [  
13                    "tol": 1E-12  
14                  ] ],  
15                  "emgr": null,  
16                  "mess":  
17                    [ [  
18                      "max_order": 100,  
19                      "tol": 1E-6  
20                    ),  
21                    [ [  
22                      "tol": 1E-12  
23                    ] ],  
24                  "morlab":  
25                    {  
26                      "tol": 1E-6  
27                    },  
28                  "pymor":  
29                    {  
30                      "tol": 1E-6  
31                    }  
32                ),  
33                "bg":  
34                  {  
35                    "emgr": null,  
36                    "mess": null  
37                  }  
38            ),  
39            "meas_opt":  
40              {  
41                "norm_id": ["l0","l1","l2","linf","h2"],  
42                "time_points": 250,  
43                "h2_method": "lyap",  
44                "ml_bodemag":  
45                  {  
46                    "FreqRange": [-8,8],  
47                    "Showplot": 0,  
48                    "MaxPoints":500  
49                  },  
50                "ml_sigmaplot":  
51                  {  
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54                    "MaxPoints":500  
55                  },  
56                "ml_frobeniusplot":  
57                  {  
58                    "FreqRange": [-8,8],  
59                    "Showplot": 0,  
60                    "MaxPoints": 500  
61                  },  
62              },  
63            "bode_opt":  
64              {  
65                "FreqRange": [-8,8],  
66                "showplot": 0,  
67                "MaxPoints": 500  
68              },  
69            "plot_opt":  
70              {  
71                "save_eps": true,  
72                "save_fig": true  
73              },  
74            "report_opt":  
75              {"tol": 1E-6,  
76              "max_order": 100}  
77          },
```

# Model Order Reduction Benchmarker (MORB)

MORB 0.1 — benchmarking stable LTI Systems in MATLAB

## MORB reports

- ▶ Measures: timings and error
- ▶ Plots: error, Bode diagrams, sigma plot, and Frobenius plot
- ▶ TeX report: autogenerated with specifications, simple formatting, and system info
- ▶ End product: PDF that can be easily shared with colleagues

# Model Order Reduction Benchmarker (MORB)

MORB 0.1 — benchmarking stable LTI Systems in MATLAB

## Ongoing and future tasks

- ▶ Upload standardized benchmark data to Zenodo with correct licenses
- ▶ Integrate MORBO with existing ontologies from MaRDI collaborators (MaRDIPortal, AlgoData, etc.)
- ▶ Publish MORB search tool in MORWiki
- ▶ Refactor MORB 0.1 in python and implement more algorithms
- ▶ Solicit feedback from the community

## Outline

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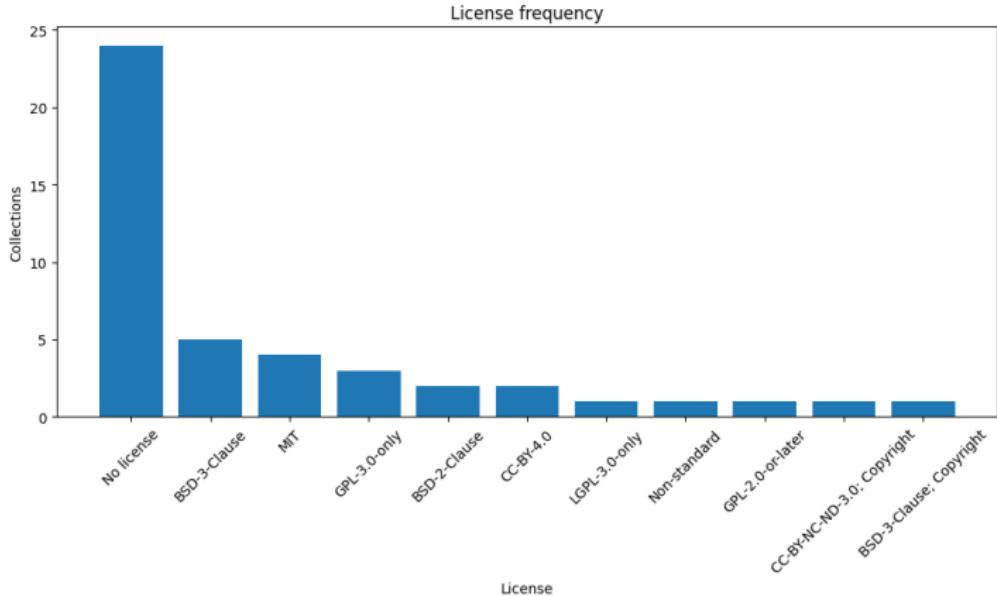
## Analyzing a Collection of Collections (MathBench)

Research Question

**What is the state of affairs in mathematical data collections?**

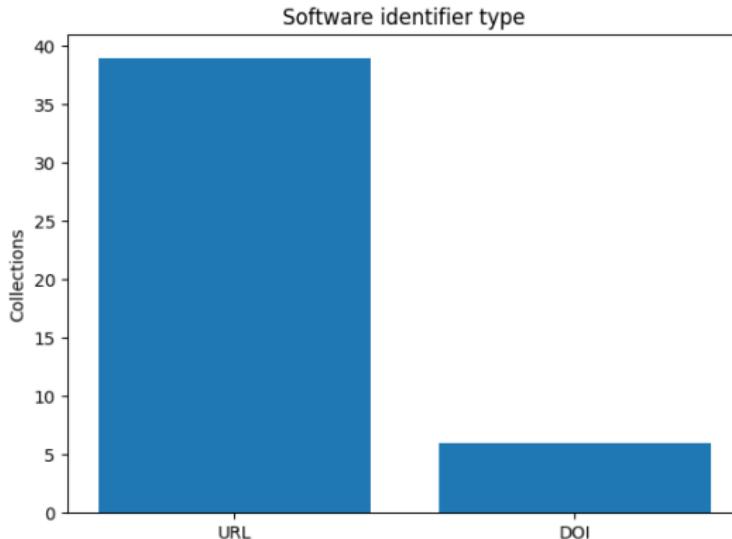
# Analyzing a Collection of Collections (MathBench)

## Licenses Used



# Analyzing a Collection of Collections (MathBench)

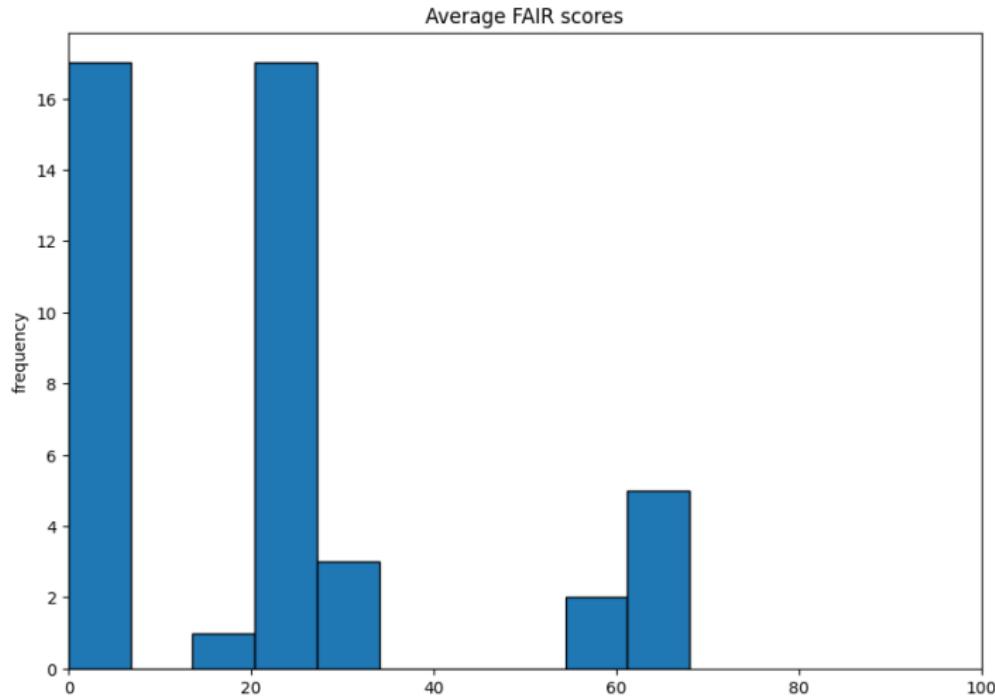
## Dataset Identifiers



# Analyzing a Collection of Collections (MathBench)

## FAIR Scores (Homepages)

scores generated using <https://www.f-uji.net/>

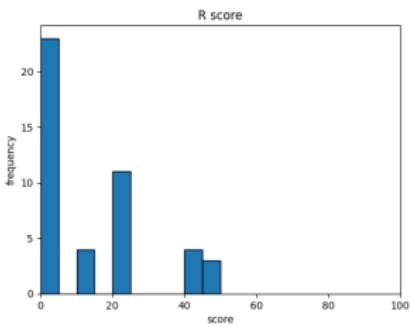
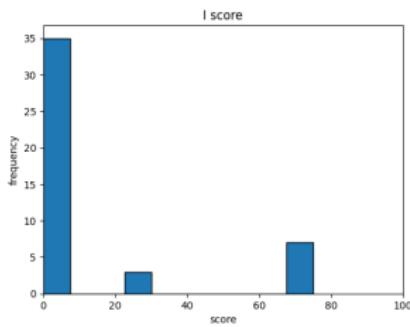
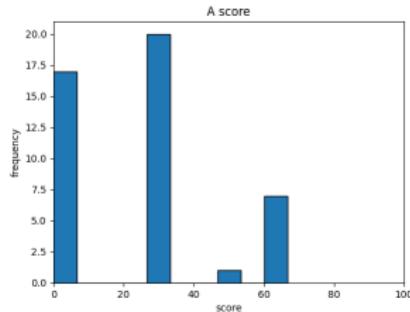
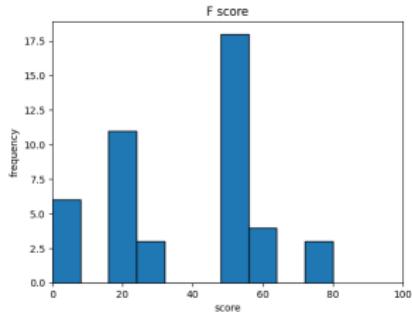




# Analyzing a Collection of Collections (MathBench)

## FAIR Scores (Homepages)

scores generated using <https://www.f-uji.net/>

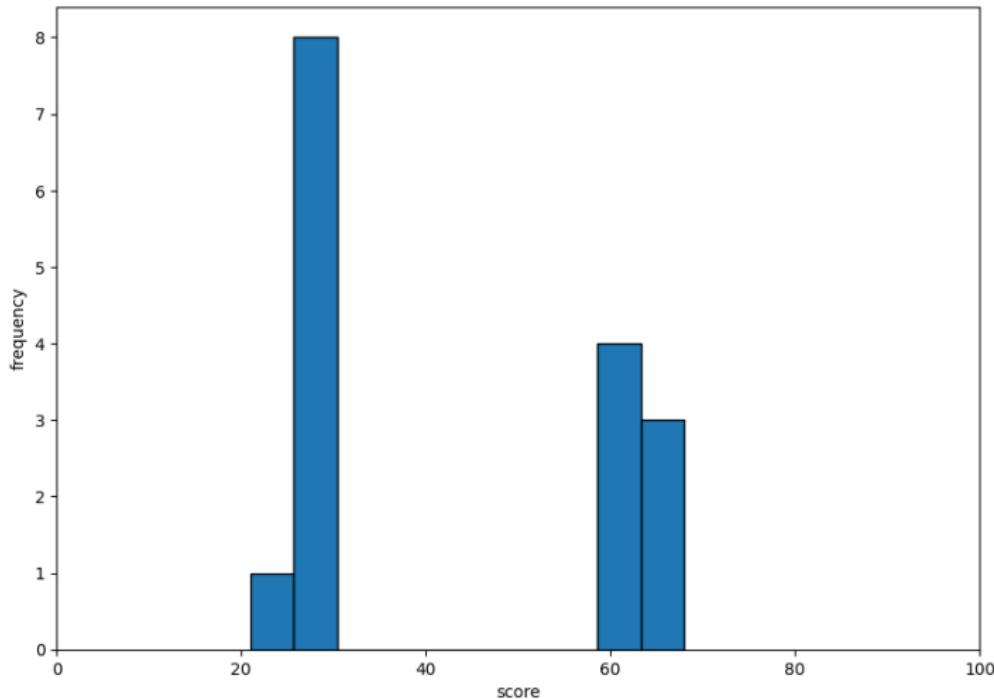




# Analyzing a Collection of Collections (MathBench)

FAIR Scores (GitHub & Zenodo)

scores generated using <https://www.f-uji.net/>

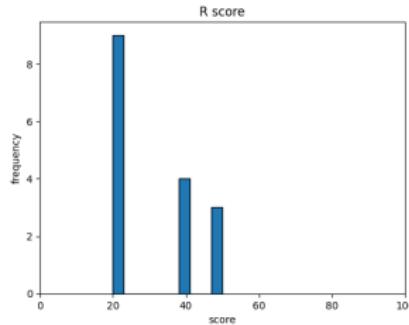
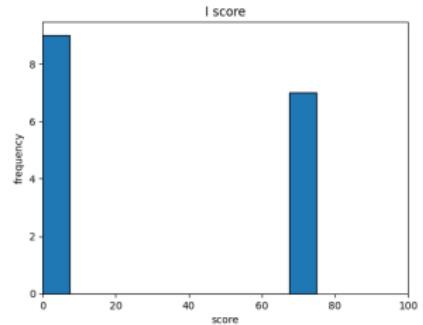
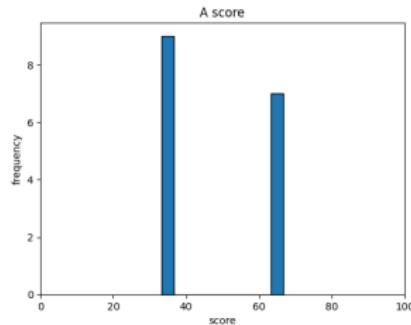
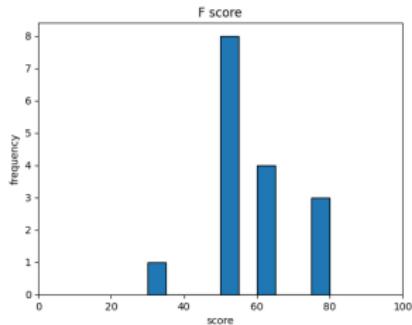




# Analyzing a Collection of Collections (MathBench)

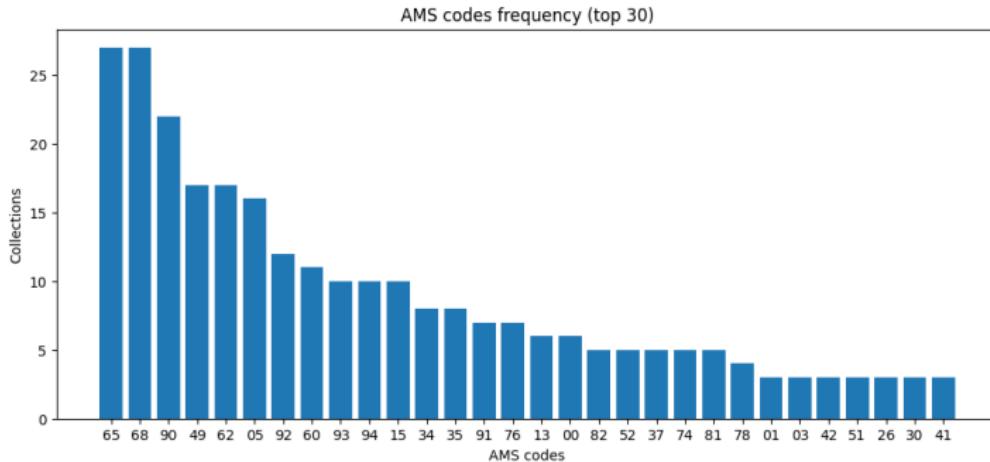
## FAIR Scores (GitHub & Zenodo)

scores generated using <https://www.f-uji.net/>



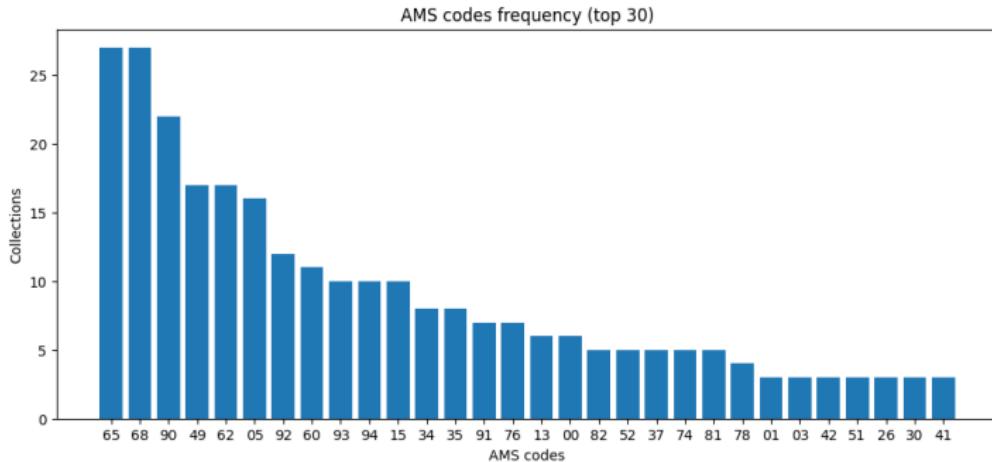
# Analyzing a Collection of Collections (MathBench)

## Mathematical Subject Classification 2020



# Analyzing a Collection of Collections (MathBench)

## Mathematical Subject Classification 2020



65 Numerical analysis

68 Computer science

90 Operations research, mathematical programming

30 Functions of a complex variable

41 Approximations and expansions



## MaRDI TA2 Team



Mario Ohlberger



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