

#### **University of Stuttgart**

Institute for Modelling Hydraulic and Environmental Systems Department of Hydromechanics and Modelling of Hydrosystems



DuMu<sup>x</sup>

Bernd Flemisch, Dennis Gläser, Timo Koch and the DuMu<sup>x</sup> development team

> DARTS Workshop TU Delft, 07.03.2023

244 Coupled free- and porous-medium flow Subsurface gas storage  $\mathsf{Du}\mathsf{Mu}^\mathsf{X}$ River engineering

1 [-] 1e-3



S<sub>g</sub>

0.75 0.50 0.25

0.0



Root-soil interaction

Outline



LH<sup>2</sup>



### DuMu<sup>x</sup> as an external Dune module







**Distributed and Unified Numerics Environment** 

### **Available Models**



Porous Me Fully Implicit	edium Flow Sequential	Free Flow Fully Implicit	Geomechanics Fully Implicit	Multidomain Fully Implicit
1p, 1p2c Richards 2p, 2p1c, 2p2c, 2pdfm, 2pminc, 2pnc, 2pncmin, co2	1p + tracer 2p + tracer	stokes navierstokes rans (0-Eq, 2-Eq)	el1p2c el2p elastic	Boundary: Darcy- Darcy, Stokes- Darcy Facet: Darcy- Darcy 1/2d-2/3d Embedded: Darcy-Darcy 1/2d-
3pwateroil mpnc + non-is	othermal	+ compositional + non-isothermal		3d

### **Further Capabilities and Characteristics**





Porous Me	edium Flow	Free Flow	Geomechanics	Multidomain
Fully Implicit	Sequential	Fully Implicit	Fully Implicit	Fully Implicit
Discretization:	Discretization:	Discretization:	Discretization:	Discretization:
<ul> <li>Box method</li> <li>Cell-centered FV with TPFA or</li> </ul>	<ul> <li>Box method</li> <li>Cell-centered FV with TPFA or</li> </ul>	<ul> <li>Staggered grid (MAC) method</li> </ul>	<ul> <li>Cell-centered method for flow</li> <li>Box for</li> </ul>	<ul> <li>Stokes-Darcy: cell-centered for PM flow, staggered for</li> </ul>
MPFA Grid Adaptivity 🗹	MPFA Grid Adaptivity 🗹		displacement	free flow •
Parallel 🗹	Parallel 🗹		Parallel 🗹	

### Status quo



- Main user base at the LH2, but there are considerably many external users
- Almost all of the development is done at the LH2, occasional external contributions
- Almost all developers have an **engineering background** with little experience in SD
- > 70 contributors so far
- 2961 version-controlled files
- 566 **tests**, the majority being regression tests by means of small simulations
- Documentation:
  - Website
  - Doxygen
  - Handbook
  - Course material

Outline



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### Development process **Git workflow**





Release branches are maintained after release, bugfixes are backported

Rebase required before merging is possible (not depicted in the image above)

### Development process DuMu<sup>x</sup> Days







### Development process Releases





A release manager is assigned for each release

The release manager tasks are listed in a GitLab Issue template (see e.g. <u>here</u>)



Outline



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### Quality assurance



### Merge requests: guidelines shown in default template

Write	Provinue
TURE	
What t	this MR does / why does DuMux need it.
TODO:	insert text here
Notes	for the reviewer
TODO:	insert text here
Before	you request a review from someone, make sure to revise the following points:
🗆 do	es the new code follow the style guide?
🗌 do	the test pipelines pass? (see guide on how to run pipelines for a merge request)
🗌 is i	the code you changed and/or the new code you wrote covered in the test suite? (if not, extend the existing tests or write new ones)
🗌 da	es your change affect public interfaces or behavior, or, does it introduce a new feature? If so, document the change in CHANGELOG.md.
🗌 is i	the list of the header includes complete? ("include what you use")
🗌 all	files have to end with a \n character. Make sure there is no \ No newline at end of file comment in "Changes" of this MR.
🗌 (if	not applicable remove) are newly introduced or modified physical values/functions backed up with a scientific reference (including doi) in the docs?
🗆 (if	not applicable remove) if the examples are modified, is the documentation regenerated (using generate_example_docs.py)































### Quality assurance Test pipelines: saving CPU time



- "Problem": very many tests that take several hours to compile (on a single core)
- Solution strategy:
  - Run only the tests that are affected by changes since the last successful run
  - Only schedules run the entire test suite
  - An example: <u>git.iws.uni-stuttgart.de/dumux-repositories/dumux/-/pipelines/20820</u>

## LH2

### Quality assurance Test characteristics



### Quality assurance **Testing simulations**

gitlab.com/dglaeser/fieldcompare fieldcompare 🌐 P 2 Branches O 0 Tags 42.4 MB Project Storage 431 Commits

Python package with command-line interface to compare field data

coverage

- Regression tests in Dumux:
  - Short simulations with a specific model
  - Comparison of the simulation results against reference solutions that were obtained earlier
  - Deviation in the results causes the test to fail
  - After bugfixes, reference results may be updated

Developers notice when a change in the code changes the physics

The test says nothing about the "physical correctness" of the model





Outline



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### Selected Benchmark Study FluidFlower International Benchmark Study (2023)

- Validation
- Invitation-only, multi-stage blind/open process
- 9 groups, 9 models
- Data from 6 experimental runs
- SRQs:
  - · Saturation and concentration fields at selected time steps
  - Integrated phase composition ... over time
  - Mean and std dev for various quantities
- Metrics: Wasserstein distance, ...
- Other reported characteristics: Model assumptions, implementation details, ...

J. Nordbotten, M. Fernø, B. Flemisch, R. Juanes (eds.) (2023): "FluidFlower: modeling, simulation, and prediction of complex multiphase flow systems", *TiPM Special Issue (planned)*.







# FluidFlower International Benchmark Study (2023) **Experimental Rig**





## FluidFlower International Benchmark Study (2023) Intended Geometry





## FluidFlower International Benchmark Study (2023) Implemented Geometry





### FluidFlower International Benchmark Study (2023) Snapshot after 240 Minutes = 4 Hours





### FluidFlower International Benchmark Study (2023) Snapshot after 4320 Minutes = 72 Hours





## FluidFlower International Benchmark Study (2023) **SRQs, Measures and Metrics**





### FluidFlower International Benchmark Study (2023) Infrastructure for Comparison and Reproduction





### Verification & Validation Other Benchmark Studies

Comput Geosci (2009) 13:409-434



International Journal of Greenhouse Gas Control 9 (2012) 234-242



Benchmarks for single-phase flow in fractured porous media

Bernd Flemisch", Inga Berre<sup>b</sup>, Wietse Boon<sup>b</sup>, Alessio Fumagalli<sup>b</sup>, Nicolas Schwenck<sup>a</sup>, Anna Scotti<sup>c</sup>, Ivar Stefansson<sup>b</sup>, Alexandru Tatomir<sup>d</sup> Verification benchmarks for single-phase flow in three-dimensional fractured porous media

Inga Berre<sup>®</sup>, Wietse M. Boon<sup>b</sup>, Bernd Flemisch<sup>6,\*</sup>, Alessio Fumagalli<sup>8,d</sup>, Dennis Gläser<sup>\*</sup>, Eirik Keilegavlen<sup>®</sup>, Anna Scotti<sup>d</sup>, Ivar Stefansson<sup>®</sup>, Alexandru Tatomir<sup>\*,J</sup>, Konstantin Brenner<sup>#</sup>, Samuel Burbulla<sup>b</sup>, Philippe Devloo<sup>1</sup>, Omar Duran<sup>1</sup>, Marco Favino<sup>1</sup>, Julian Hennicker<sup>#</sup>, I-Hsien Lee<sup>1,m</sup>, Konstantin Lipnikov<sup>®</sup>, Roland Masson<sup>#</sup>, Klaus Mosthaf<sup>®</sup>, Maria Giuseppina Chiara Nestola<sup>®</sup>, Chuen-Fa Ni<sup>1,m</sup>, Kirill Nikitin<sup>®</sup>, Philipp Schädle<sup>\*</sup>, Daniil Svyatskiy<sup>®</sup>, Ruslan Yanbarisov<sup>®</sup>, Patrick Zulian<sup>®</sup>

## Outlook A Bayesian Validation Framework



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### **Bayesian validation**

- Uncertainty propagation using posterior
- · Comparison with new data
- Computation of validation metric

### **Prior knowledge**

- Input parameters
- Expert knowledge
- Computational Model(s)

### Valid or not?

- Qualitative (visual) comparison
- Quantitative comparison
- Hypothesis testing

### **Bayesian calibration**

- Bayesian inference
- Comparison with observation data

• Update prior knowledge to obtain posterior

### Surrogate modeling

- Uncertainty propagation
- Speed-up of the inference step
- A cheap-to-evaluate model

F. Mohammadi, S. Oladyshkin, E. Eggenweiler, B. Flemisch, I. Rybak, M. Schneider, K. Weishaupt (2023): "A Surrogate-Assisted Uncertainty-Aware Bayesian Validation Framework and its Application to Coupling Free Flow and Porous-Medium Flow", *in review*.

Outline



LH<sup>2</sup>



# Reproducibility Ingredients for Reproducing/Reusing Computations





Reproducibility

### Improved accessibility, reusability, and archival of research software





T. Koch, D. Gläser, A. Seeland, S. Roy, K. Gönner, K. Weishaupt, D. Boehringer, S. Hermann, B. Flemisch (2023): "A sustainable infrastructure concept for improved accessibility, reusability, and archival of research software", *in preparation*.

# Reproducibility Digital Workflows





### Reproducibility **Workflow Tools: Implementations**

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github.com/BAMresearch/NFDI4IngScientificWorkflowRequirements

## Reproducibility Workflow Tools: Manuscript



RESEARCH ARTICLE

Evaluation of tools for describing, reproducing and reusing scientific workflows

Philipp Diercks<sup>2</sup> Dennis Gilber ()<sup>1</sup> Ontje Lünsdorf<sup>3</sup> Michael Setzer ()<sup>4</sup> Bennt Flemisch ()<sup>2</sup> Jörg F. Unger ()<sup>1</sup>

 Department 7.1 Moleting and Simulation, Bundenamisti für Materialitistickung und -pröting (BAM), Bellin.
 Lehnstatt für Wasser und Umaerlegeterminstellerung, University of Builigert, Builigert, S. Imath 4% Vereister Exceptionstrement. Exception für Lufe. und Reamfahrs, Orderbuig.

4. Institut für Angewandle Materialen MM, Karlsnaher Institut für Technologie, Karlsnahe

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2012-12-05

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Keywords. FAIR, reproductality, scientific

workflows, tool companison, workflow management

Data evaluability: Data can be found here: https://githuk.com/date.eoe arch/WED40.epictaettfscher http://wEngliteettjs

Software can be found here: https://githuk.com/Add/eve arch/WEI40xg8ciaetificAdd/ V/jowRegai/commta

Abstract. In the field of computational science and engineering, workflows often entail the application of various software, for instance, for simulation or pre- and postprocessing. Typically, these components have to be combined in arbitrarily complex workflows to address a specific research question. In order for peer researchers to understand, reproduce and (re)use the findings of a scientific publication, several challenges have to be addressed. For instance, the employed workflow has to be automated and information on all used software must be available for a reproduction of the results. Moreover, the results must be traceable and the workflow documented and readable to allow for external verification and greater trust. In this paper, existing workflow management systems (WIMSs) are discussed regarding their suitability for describing, reproducing and reusing scientific workflows. To this end, a set of general requirements for WIMSs were deduced from user stories that we deem relevant in the domain of computational science and engineering. On the basis of an exemplary workflow implementation, publicly hosted at GRHub (https://github.com/RAMresear ch/MF014IpigScient171cMork/FigMinipul/remont (), a selection of different WMSs is compared with respect to these requirements, to support fellow scientists in identifying the WIMSs that best suit their requirements.

#### 1 Introduction

2 With increasing volume, complexity and creation speed of scholarly data, humans rely more

- and more on computational support in processing this data. The "FAIR guiding principles for
- 4 scientific data management and stewardship" [41] were introduced in order to improve the ability





COMMON WORKFLOW LANGUAGE

DoIt Automation Tool

Kadi<sup>4Mat</sup>

AGiiA

ctflow

**anake**make

Reproducibility
Workflow Tools: Simple Use Case





### Summary



### Development

- Standardized Git workflow enforced by GitLab policies or instructed
- Release process is "standardized" via issue template

### Quality Assurance

- Automated test pipelines for various setups
- Mainly regression testing of small simulations

### Verification & Validation

- Benchmarking allows model evaluation and comparison
- Uncertainties in models and experiment should be quantified
- Reproducibility
  - Key ingredients are automation and containerization
  - Possibly facilitated by workflow tools

### Is DuMu<sup>x</sup> right for you?

- Large **variety** of available models.
- Flexible monolithic **coupling** framework.
- Focus on model development rather than applications (or numerics).
- Not a "classical" reservoir simulator.
- "Easy" to customize/add balance equations and constitutive relations.
- Adding new **discretization methods** is challenging.
- **C++** skills are required to do something substantially new.
- **Python** bindings are working, but not fully exploited yet.
- Friendly and welcoming user/developer community.
- Find out at this year's DuMu<sup>x</sup> course 3.-5.4.2023 in Stuttgart:











## Thank you!



### **Bernd Flemisch**

e-mail bernd@iws.uni-stuttgart.de phone +49 (0) 711 685- 69162

Universität Stuttgart Department of Hydromechanics and Modelling of Hydrosystems Pfaffenwaldring 61, 70569 Stuttgart, Germany

