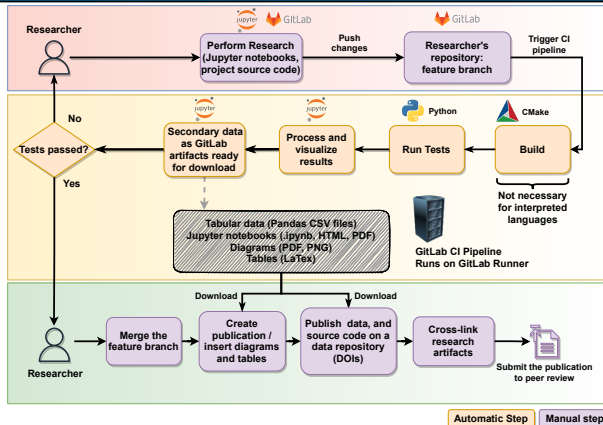


# "Continuous" Integration of Scientific Software (in Computational Science and Engineering)



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Students@SC21 2021-11-17

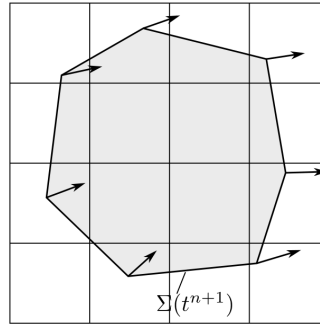
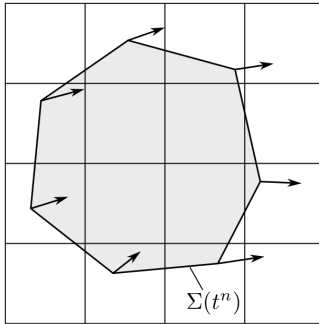


# Motivation: multiphase flow simulation methods

## Lagrangian / Eulerian Interface Advection (LEIA) methods



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- Fluids that do not mix are separated by an interface  $\Sigma(t)$  (surface in 3D).
- Goal: track  $\Sigma(t)$  as it moves in time  $t$  and changes its topology.

# Motivation: multiphase flow simulation software

## Lagrangian / Eulerian Interface Advection (LEIA) Methods



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LEIA methods <sup>1, 2, 3, 4, 5</sup> require **thorough testing**:

- **Verification** cases: evolution of  $\Sigma(t)$  and two-phase flows with exact solutions.
- **Validation** with respect to experiments.
- Testing **serial and parallel computational efficiency**.

---

<sup>1</sup>Marić, T., Marschall, H., & Bothe, D. (2015). IentFoam—A hybrid Level Set/Front Tracking method on unstructured meshes. *Computers & Fluids*, 113, 20-31.

<sup>2</sup>Tolle, T., Bothe, D., & Marić, T. (2020). SAAMPLE: A Segregated Accuracy-driven Algorithm for Multiphase Pressure-Linked Equations. *Computers & Fluids*, 200, 104450.

<sup>3</sup>Marić, T., Kothe, D. B., & Bothe, D. (2020). Unstructured un-split geometrical Volume-of-Fluid methods—A review. *Journal of Computational Physics*, 420, 109695.

<sup>4</sup>Marić, T. (2021). Iterative Volume-of-Fluid interface positioning in general polyhedrons with Consecutive Cubic Spline interpolation. *Journal of Computational Physics: X*, 11, 100093.

<sup>5</sup>Tolle, T., Gründing, D., Bothe, D., & Marić, T. (2021). Computing volume fractions and signed distances from triangulated surfaces immersed in unstructured meshes. *arXiv preprint arXiv:2101.08511*.

# Computational Science and Engineering software in university research groups

Boundary and initial conditions



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- Publish or perish 🎓<sup>6</sup> prioritizes publications over scientific software.
- Dedicated resources for increasing software quality are usually not available.
- Ph.D. students rotate every 3-5 years, postdocs every 1-2 years.
  - ▢ Little or no overlap between successors and predecessors.
- Large-scale software design is not a mandatory part of the CSE curriculum.
  - ▢ Different CSE background: (Applied) Mathematics, Mechanical Engineering, Physics, Informatics.

---

<sup>6</sup>Symbol of a publish-or-perish simplification of the workflow :)

# NFDI4Ing to the rescue!

Resources for engineering research software



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## NFDI4Ing

productive since 2017

### Archetypes

ALEX



bespoke  
experiments with  
high variability  
of setups

BETTY



engineering  
research software

CADEN



provenance  
tracking of physical  
samples & data  
samples

DORIS



high performance  
measurement &  
computation

ELLEN



extensive &  
heterogeneous data  
requirements

FRANK



many participants &  
simultaneous  
devices

GOLO



field data &  
distributed systems

## NFDI4Ing resources.

"Continuous" Integration of Scientific Software(in Computational Science and Engineering) -  
T. Marić, T. Tolle, J.P. Lehr, I. Pappagianidis, B. Lambie, D. Bothe, C. Bischof

# BSSW to the rescue!

Resources for engineering research software



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<https://bssw.io>



**better  
scientific  
software**

**Better Scientific Software** resources.

"Continuous" Integration of Scientific Software(in Computational Science and Engineering) -

T. Marić, T. Tolle, JP. Lehr, I. Pappagianidis, B. Lambie, D. Bothe, C. Bischof

# Computational Science and Engineering software in university research groups

The chaos scientific legacy code



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BETTY



engineering  
research software

Betty is a CSE researcher, working with a legacy research code.  
Why is Betty so (rightfully) angry?

- Betty inherited a **research software that is only partially tested**.
- Betty inherited a **research software that isn't automatically tested**.
  - Betty changes one part of the code and gets her model running, only to see 10 other things fail, after days of manually running tests.
- Betty's software has **no documentation of the scientific workflow**.
  - Betty doesn't know how to use existing scripts to run simulations and analyze (reproduce) results.
- Betty's software has **disjoint (diverging) versions** - that she can't integrate.
- **Betty can't even find code versions used to generate results in the publications from her research group.**

# Computational Science and Engineering software in university research groups

The chaos of developing entirely new research software



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"Après moi, le déluge" - "After me, the flood"

Louis XV of France

Research software generally does not matter, as long as papers are published (🎓).

## Missed opportunities

- *Finding results* made easy by cross-linking code versions, data and publications.
- *Faster extension / combination of existing ideas* if their respective versions are integrated.
- *Faster comparison of results* with previous ideas automating verification / validation.
- *Automatic reproducibility* of results using automated testing and version control.
- *Faster onboarding* with documented scientific verification and validation workflows.



# Computational Science and Engineering software in university research groups

Continuous integration and cross-linking to the rescue



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**Automated testing** (verification and validation), **version control**, and **cross-linking** reports, source code and research data increase Findability, Accessibility and Reproducibility (**FAIR**) and **speed up research**.

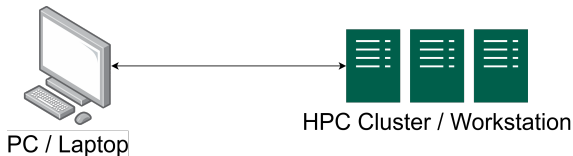
- **Continuous Integration (CI) = automatic testing + version control.**
- CSE research requires **scientific workflows**: initialize simulations, run parameter variations, agglomerate data, visualize, and check results.
- CI can be used to **automate and document scientific workflows**.
- CI ensures that the **integration of new changes does not break existing functionality**.
- Once the changes are integrated, the publication, the source code and the data are published on pre-print and data repositories and **cross-linked** using git tags and DOIs.

# Continuous Integration of Scientific Software

## Research Software Workflow I



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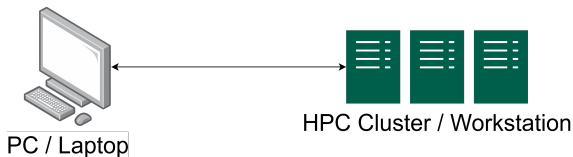
```
while Results are unsatisfactory do  
    Work on algorithms.  
    (Compile the code.)  
    for All studies do  
        Prepare the study.  
        Run the study.  
        Analyze results.  
        Move results to a report.  
    end for  
    Compare old and new results.  
end while
```

# Continuous Integration of Scientific Software

## Research Software Workflow II



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### Issues...

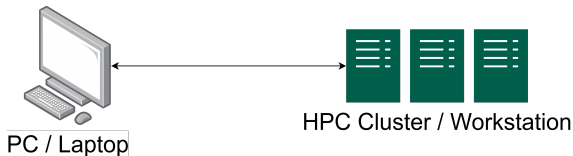
- Starting studies takes time.
- Analyzing results takes time.
- Often the results are not checked "live" as the study runs - **waste of research time and CPUh.**
- **Only the researcher knows the details** behind the initialization, running and post-processing scripts - **when this person leaves, the reproducibility is gone.**
- A researcher may forget to run a study and believe all tests have passed.

# Continuous Integration of Scientific Software

Automating the research workflow I



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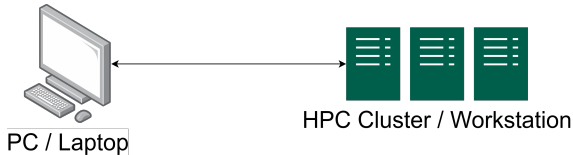
```
while Results are unsatisfactory do  
    Work on algorithms.  
    (Compile the code.)  
    for All studies do  
        Prepare the study.  
        Run the study.  
        Analyze results.  
        Move results to a report.  
    end for  
    Compare old and new results.  
end while
```

# Continuous Integration of Scientific Software

Automating the research workflow I



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**while** Results are unsatisfactory **do**  
Work on algorithms.  
(Compile the code.)  
Run initialization scripts (jobs).  
Run simulation scripts (jobs).  
(Run postprocessing scripts (jobs)).  
Visualize results live in Jupyter notebooks.  
**end while**

# Continuous Integration of Scientific Software

## Automating the research workflow II



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Manual steps of the research workflow,

(Compile the code.)

**for** All studies **do**

    Prepare the study.

    Run the study.

    Analyze results.

    Move results to a report.

**end for**

Compare old and new results.

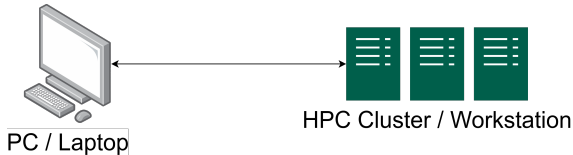
are now automated using scripts **that do not require additional knowledge / input (metadata).**

# Continuous Integration of Scientific Software

## Automating the research workflow III



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1. The **new** results are satisfactory.
2. Similar automated workflows are executed for existing tests.
3. All results are checked.
4. The milestone has been reached, the version can be integrated.

Works well manually when there aren't many previous verification/validation tests and their analysis is relatively simple.

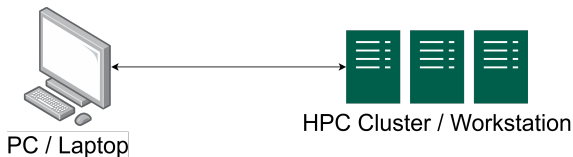
**Are we sure that we ran all the tests and examined the results properly?**

# Continuous Integration of Scientific Software

## Automating the research workflow III



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- **Manual testing takes a lot of time.**
- **Manual testing** of all previous tests **is prone to error** - even if V&V scripts do not require metadata.
- Relevant **V&V tests are automated using Continuous Integration (CI)**.
  - ▣ Changes are pushed to the upstream version control repository.
  - ▣ The remote repository starts the so-called **CI test pipeline** (a sequence of tests).
  - ▣ Tests are automatically run, processed and visualized.

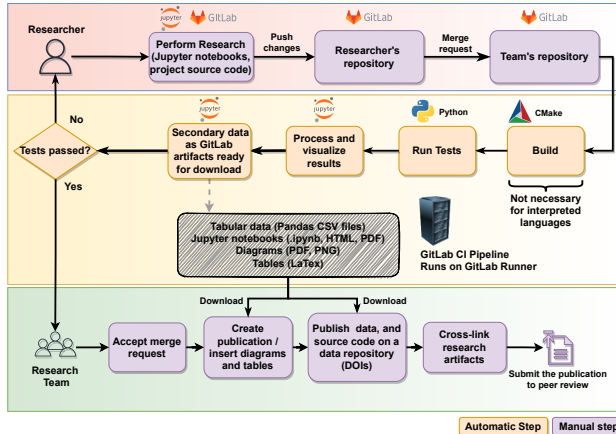


# (Continuous) Integration of scientific software

## Schematic diagram for the team workflow



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Working in a team.

# (Continuous) Integration of scientific software

CI in a nutshell I



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- A **text (YAML) file** is added to a repository, that **specifies the tests** (jobs) in a CI pipeline.
- When the YAML file is pushed to an upstream git repository (GitLab), **GitLab creates a CI pipeline from the YAML file**.
- The CI pipeline needs a **machine for running tests - the GitLab runner**.
  - ▢ Shared runners on gitlab.com have limited capacity.
  - ▢ We can install and register our own GitLab runner.
- A **Docker image encapsulates the computing environment**.
  - ▢ **Virtualization/Containerisation** increases reproducibility and simplifies testing.
- The Docker image must be publicly accessible for it to be used by a shared runner.

# (Continuous) Integration of scientific software

## CI in a nutshell II



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### initialization\_param\_study:

**stage:** running

**dependencies:**

- build\_release

**script:**

*# run the parameter variation tests*

- cd cases/initialization/3dinit
- ./create\_and\_run\_levelset.sh
- ./reproduce\_publication\_results.sh

**artifacts:**

**paths:**

- cases/initialization/3dinit/\*.csv
- cases/initialization/3dinit/\*.pdf

### Example YAML file

- The **CI pipeline starts the right scripts in the right order**: it documents the research workflow.
- A click of a button in a web browser reproduces results for any version of the research software.
- Continuous **integration** is used to **integrate** only those changes that improve the software and don't break existing tests.

# (Continuous) Integration of scientific software

CI in a nutshell I



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## An example CI pipeline

Pipeline Needs Jobs 5 Failed Jobs 1 Tests 0

### Building



build



### Running



param\_study



### Visualization



convert\_not...



### Testing



test\_hadamard...



test\_shear2D



# (Continuous) Integration of scientific software

## CI in a nutshell II



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convert\_notebooks

Retry

Duration: 51 seconds

Timeout: 1h (from project)



Runner: #380987 (ed2dce3a) shared-runners-manager-6.gitlab.com

### Job artifacts

These artifacts are the latest. They will not be deleted (even if expired) until newer artifacts are available.

Keep

Download

Browse

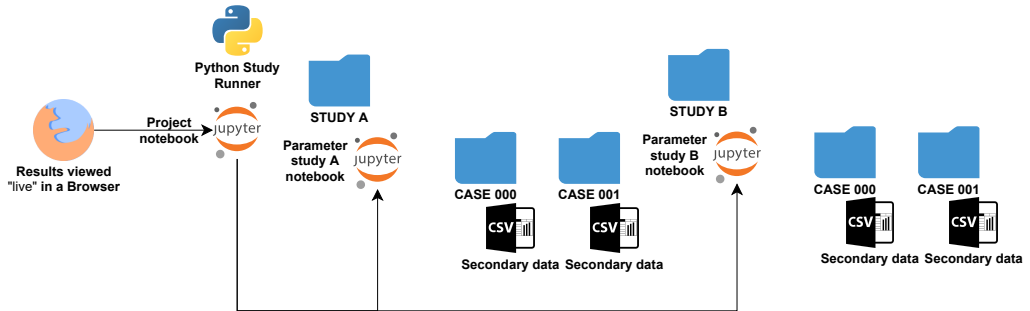
- Files created within a CI job are gone when the job ends.
- GitLab uses **job artifacts** to pass on data from one job to the next.
- **Job artifacts can only be files stored in project's sub-folders.**
- Libraries and applications are passed to other jobs as artifacts.
- **Artifacts can be downloaded on the GitLab project website.**

# (Continuous) Integration of scientific software

## Running tests I



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Organize your simulation studies.



- Success of CSE methods is measured using verification and validation data.
- Effective comparison with others (previous versions) hinges on data organization.
- **Goal:** easily **programmatically identify** parameters used in a simulation case.
- **Legacy code:**
  - ▣ use the existing folder structure and parameterization tools
  - ▣ The mapping (case000) → (parameter vector) must be stored (YAML, ...)
- **New code:**
  1. Simple folder and file structure
  2. HDF5<sup>7</sup> or other open data format.
  3. Alternative to HDF5: **ExDir**<sup>8</sup>

---

<sup>7</sup><https://www.hdfgroup.org/solutions/hdf5>

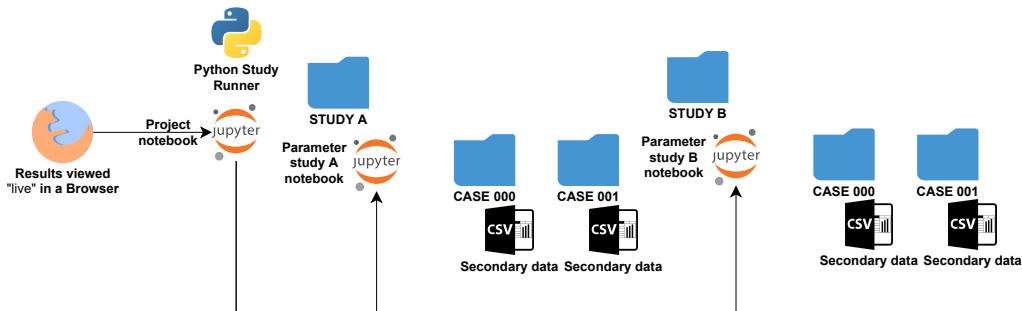
<sup>8</sup>Dragly, Svenn-Arne, et al. "Experimental Directory Structure (Exdir): An alternative to HDF5 without introducing a new file format." Frontiers in neuroinformatics 12 (2018): 16.

# (Continuous) Integration of scientific software

## Running tests I



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- Associate simulation cases with their metadata.
- `{case000 : {N_CELLS: 32, MODEL : shear2D}}`
- Store this information using a standard open-source format (**Interoperability** in **FAIR**).



# (Continuous) Integration of scientific software

## Running tests II



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Use Jupyter notebooks<sup>9</sup> and pandas<sup>10</sup> for

- **Documentation:** geometry, initial and boundary conditions, error norms, comparison data.
- **Data processing:** verification errors (conservation, convergence, stability), validation errors
- **Result analysis:** interactive and remote, while simulations are running!

---

<sup>9</sup><https://jupyter.org/>

<sup>10</sup><https://pandas.pydata.org/>



```
jupyter nbconvert notebook.ipynb --execute --to FORMAT
```

- Agglomerate secondary data into `pandas.MultiIndex` CSV files.
- Run each jupyter notebook in the repository.
- Export secondary data and notebooks in different formats as artifacts.
- **Visualization**
  - ▣ Download the artifact and open the notebook 🎓.
  - ▣ Notebooks contain information on failing tests.
  - ▣ Mapping "caseID" → "parameters" is crucial for re-starting failed parameter variations!

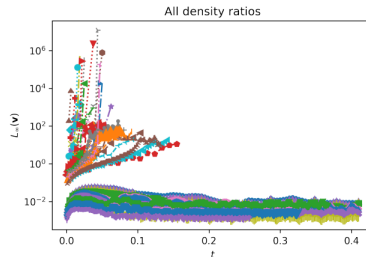
# (Continuous) Integration of scientific software

## Secondary data I



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- Data used for diagrams and tables in a publication.
- Data we compare our results with.
- Data we waste time scanning from (sometimes our own) publications in CSE.



(a) Old inconsistent method: interface stable only for cases with density ratio  $\rho^-/\rho^+ = 1$

Imagine scanning this diagram.

Preprint: <https://arxiv.org/abs/2109.01595>

Data: <https://doi.org/10.48328/tudatalib-627>



`pandas.MultiIndex` CSV with metadata for secondary data

- `pandas.MultiIndex` saved in "metadata columns".
- **Metadata is repeated**: not an issue for the small secondary data!
- Metadata in columns → `pandas.MultiIndex` → strongly simplified data analysis.
- **Direct readable export of tables to LaTeX!**

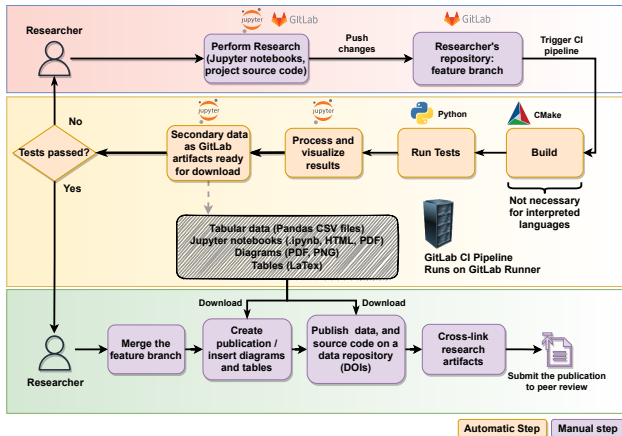
	H	L_INF	O(L_INF)	EPSILON_R_EXACT_MAX	O(EPSILON_R_EXACT_MAX)
VELOCITY_MODEL					
<b>SHEAR_2D</b>	0.125000	0.032961	1.833407	0.032961	1.833407
<b>SHEAR_2D</b>	0.062500	0.009249	1.955529	0.009249	1.955529
<b>SHEAR_2D</b>	0.031250	0.002385	1.988745	0.002385	1.988745
<b>SHEAR_2D</b>	0.015625	0.000601	1.997178	0.000601	1.997178
<b>SHEAR_2D</b>	0.007813	0.000150	1.999294	0.000150	1.999294
<b>SHEAR_2D</b>	0.003906	0.000038	1.999294	0.000038	1.999294

# (Continuous) Integration of scientific software

## Schematic diagram for the individual workflow



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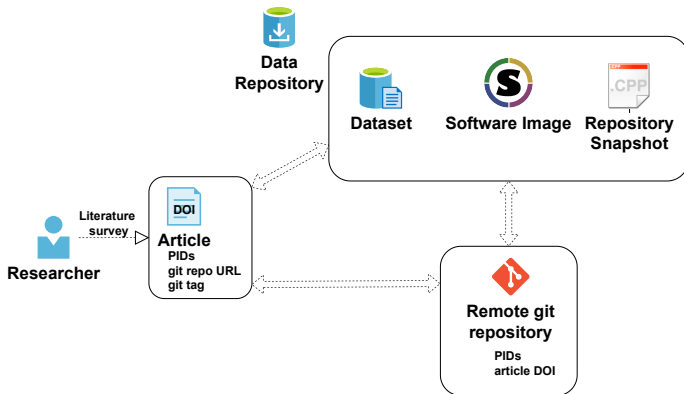
Working alone.

# (Continuous) Integration of scientific software

## Cross-linking I



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Cross-linking is done manually.

- Place whatever you can under version control.
- **When a set of milestones is reached (release)** , use **git-tags** as version snapshots, and upload the research data to a data repository, e.g. **TUDatalib** at TU Darmstadt, or **Zenodo**.
  - Secondary data (diagrams, tables), raw data (simulations, experiments), archive of the research software, ...
- Data uploaded to a data repository is associated with Persistent Identifiers (PIDs), e.g. DOIs.
- Cite the research data using DOIs in the report (article, preprint).
- Upload the report to a pre-print repository, e.g. **ArXiv**.
- Edit the data on the data repository and mention the arXivID.
- Submit the pre-print to a journal for peer-review.



- **Research software is compared with existing publications.**
- A major milestone are improved results for a set of verification / validation tests.
- The cross-linking therefore revolves around the publication (pre-print, report, ...).
- The cross-linking makes it possible to find the version of research software used to generate the results in the publication: repository link + git tag, repository snapshot, software image.
- Once the version is found, CI automatically reproduces all results from the publication with a click of a button.

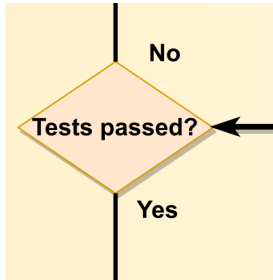


# (Continuous Integration with result visualization)

## Test evaluation I



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### Straightforward for easily quantifiable errors

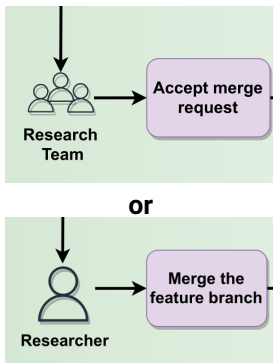
- **Examples:** volume conservation, order of convergence, total wall clock time, weak scaling, ...
- **Python scripts test secondary data** agglomerated by Jupyter notebooks from simulation results.

# (Continuous Integration with result visualization)

## Test evaluation II



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### Difficult for errors that cannot be quantified easily

#### ■ Examples:

- Is the difference between simulation and experiment data  $\leq 4\%$ ?
- How to quantify the difference for complex signals?

#### ■ Option 1: Researchers evaluate the test results even if all CI jobs pass.

- A simple and efficient solution 🎓.

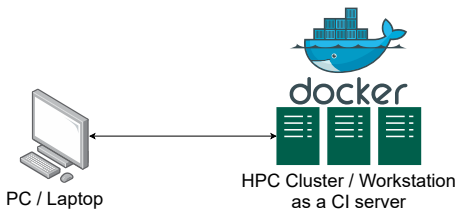
#### ■ Option 2: Use statistics to quantify the difference.

# (Continuous) Integration of scientific software

## Docker (containerization)



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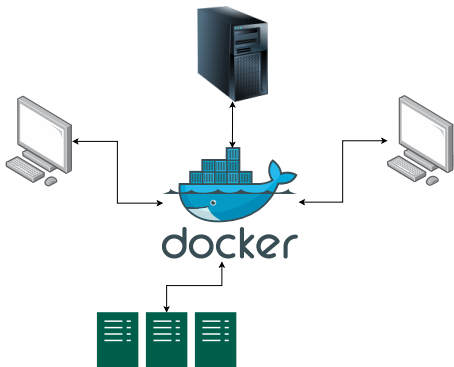
- Instead of installing the research software only on the laptop/PC and the HPC cluster / workstation, we install it in a virtual environment - **a Docker image**.
- The Docker image then works on any machine that runs Docker.
- Sharing research software becomes trivial - if our colleague wants to use our software, no installation (besides Docker) is required.

# (Continuous) Integration of scientific software

## Docker (containerization)



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- Instead of installing the research software only on the laptop/PC and the HPC cluster / workstation, we install it in a virtual environment - a **Docker image**.
- The Docker image then works on any machine that runs Docker.
- Sharing research software becomes trivial - if our colleague wants to use our software, no installation (besides Docker) is required.



The GitLab CI requires a **GitLab runner: a machine that runs the CI jobs.**

1. **Short few CPU-core tests:** work-PC 🎓.
2. **Short many-core tests:** obtain a workstation with a 64-Core CPU<sup>11</sup> 🎓.
3. **HPC tests:** combine 1. or 2. with an HPC cluster.

An HPC cluster is relevant for production tests and performance measurements.

- This workflow uses coarse ("smoke") tests 🎓
  - ▢ Unit tests run for 1. and 2.
  - ▢ Convergence ensured for 1. and 2.
  - ▢ Is efficient in parallel for 1. and 2.
- **Challenge:** Is it possible to combine 1., 2. and 3. and publish instead of perish 🎓?

---

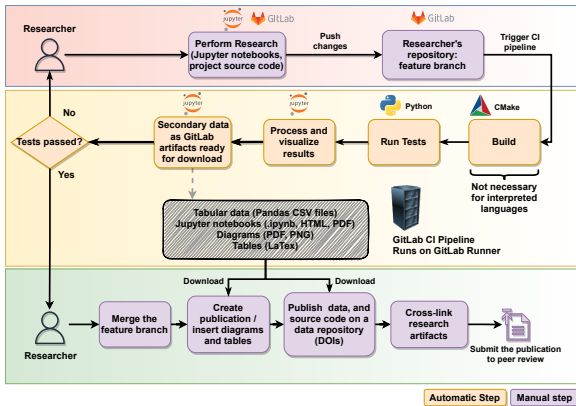
<sup>11</sup>Thanks to [CRC 1194 at TU Darmstadt](#).

# (Continuous) Integration of scientific software

## Summary



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- 1: Track changes using version-control.
- 2: **while** Milestone not reached **do**
- 3:     **for** study in studies **do**     ▷ On an HPC cluster.
- 4:         Automate data processing and visualization.
- 5:         Run study.
- 6:         Check results and apply code changes.
- 7:     **end for**
- 8:     **if** results are improved on the HPC cluster **then**
- 9:         Push changes to the remote repository.
- 10:        **if** CI pipeline tests pass **then**
- 11:          Milestone reached.
- 12:          Add new tests to the CI pipeline,
- 13:          Merge feature into development branch.
- 14:          Cross-link publication, data, and source code.
- 15:        **end if**
- 16:     **end if**
- 17: **end while**

# (Continuous) Integration of scientific software

Similarity with other workflows / best practices



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Our (*subjective*) estimates\* of similarity 1 – 5 (higher is more similar), –: aspect not addressed.

DOI	Branching model	TDD	Cross-linking	CI	(Meta)data standardization
10.12688/f1000research.11407.1	-	-	-	-	1
10.3934/math.2016.3.261	-	-	-	-	2
10.1371/journal.pbio.1001745	1	2	-	-	-
10.1371/journal.pcbi.1005510	-	-	3	1	3
10.1145/2723872.2723881	1	-	-	1	-
10.1145/3324989.3325719	1	-	-	5	-
10.1371/journal.pone.0230557	1	-	-	1	4
10.1145/3219104.3219147	1	-	-	4	-

*\*The list may still be incomplete.*

# (Continuous) Integration of scientific software

Hands on: overview



TECHNISCHE  
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## 1. Repository preparation

A minimal repository representing an exemplary "status quo".

## 2. Create a Docker image

Configure a reproducible testing environment.

## 3. Define CI pipeline through a YAML file

Define tests, how and when they are executed and what results to store.

## 4. Setup your own GitLab runner

Provide a machine for execution of tests.



# (Continuous) Integration of scientific software

Hands on: prepare the example repository



TECHNISCHE  
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DARMSTADT

Create your own copy of the example repository by forking:

- Log in to <https://gitlab.com/>.
- Go to <https://gitlab.com/tmaric/minimal-cse-ci-examples>.
- Click **fork** (upper right corner).
- Select a namespace, e.g. your personal one.
- Select either *Private* or *Public* as visibility level, both are fine.
- Click **Fork project**.
- Clone your fork on your machine:  

```
?> git clone your-fork-URL
```

# (Continuous) Integration of scientific software

Hands on: overview



TECHNISCHE  
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# (Continuous) Integration of scientific software

Hands on: install Docker I



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Specific steps depend on your Linux distribution ([Docker documentation](#))

Here for [Ubuntu Focal](#):

1. `?> sudo apt-get update`
2. `?> sudo apt-get install apt-transport-https ca-certificates curl gnupg lsb-release`
3. `?> curl -fsSL https://download.docker.com/linux/ubuntu/gpg \`  
`| sudo gpg --dearmor -o /usr/share/keyrings/docker-archive-keyring.gpg`
4. `?> echo \`  
`"deb [arch=amd64 signed-by=/usr/share/keyrings/docker-archive-keyring.gpg] \`  
`https://download.docker.com/linux/ubuntu \`  
`$(lsb_release -cs) stable" | sudo tee /etc/apt/sources.list.d/docker.list > /dev/null`
5. `?> sudo apt-get update`
6. `?> sudo apt-get install docker-ce docker-ce-cli containerd.io`

# (Continuous) Integration of scientific software

Hands on: install Docker II



TECHNISCHE  
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DARMSTADT

Check your Docker installation by running

```
■ ?> sudo docker run hello-world
```

The output should look as shown on the right.

```
CSI\tolle@wmpc82:~$ sudo docker run hello-world

Hello from Docker!
This message shows that your installation appears to be working correctly.

To generate this message, Docker took the following steps:
 1. The Docker client contacted the Docker daemon.
 2. The Docker daemon pulled the "hello-world" image from the Docker Hub.
    (amd64)
 3. The Docker daemon created a new container from that image which runs the
    executable that produces the output you are currently reading.
 4. The Docker daemon streamed that output to the Docker client, which sent it
    to your terminal.

To try something more ambitious, you can run an Ubuntu container with:
$ docker run -it ubuntu bash

Share images, automate workflows, and more with a free Docker ID:
https://hub.docker.com/

For more examples and ideas, visit:
https://docs.docker.com/get-started/

CSI\tolle@wmpc82:~$
```

# (Continuous) Integration of scientific software

Hands on: creating a Docker image



TECHNISCHE  
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DARMSTADT

In the **minimal-cse-ci-examples** repository

```
?> git checkout starting-point
```

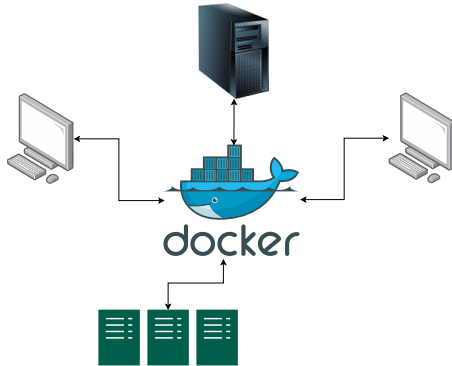
```
?> git checkout -b feature/dockerfile
```

# (Continuous) Integration of scientific software

## Hands on: creating a Docker image I



TECHNISCHE  
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- **Docker** images are computing environments that contain (**dependencies**) needed to build the research software, run simulations and process results.
- Sharing docker images removes the need to install the dependencies on different machines.
- The computing environment in a Docker image is usually based on an existing Linux distribution.
- The Docker image is built from a text file, that specifies installation steps for the dependencies, the so-called **Dockerfile**.

# (Continuous) Integration of scientific software

## Hands on: creating a Docker image II



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In a file named 'minimal-cse-ci-dockerfile\_ubuntu-focal', write

```
FROM ubuntu:focal
```

```
# Set timezone
```

```
RUN apt-get update --fix-missing && \
    DEBIAN_FRONTEND="noninteractive" apt-get -y install tzdata
```

- We'll use Ubuntu 20.04 (focal) as the base system.
- Steps that are usually done manually (setting the timezone) are automated.

# (Continuous) Integration of scientific software

## Hands on: creating a Docker image III



## Dependency installation

*# Install packages*

```
RUN apt update && apt-get install --fix-missing -y \  
# Building  
build-essential cmake \  
# Version control  
git \  
# Python  
python3 \  
# Visualization  
python3-matplotlib python3-numpy \  
# Data analysis  
python3-pandas \  
# Test visualization  
jupyter-notebook jupyter-nbconvert \  
# Debugging the image  
vim
```

- **RUN** runs commands in the **Docker container**.
- The **Docker container** is a process spawned using the Docker image as the computing environment.
- Install the software needed for the scientific workflow (dependencies).



# (Continuous) Integration of scientific software

## Hands on: creating a Docker image IV



TECHNISCHE  
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DARMSTADT

### Software setup

```
## Default Ubuntu to python3
```

```
RUN update-alternatives --install \
    /usr/bin/python python /usr/bin/python3 10
```

### Some specifics

- Alternative (**g++**) compiler.
- Alternative working directory.

# (Continuous) Integration of scientific software

## Hands on: creating a Docker image V



TECHNISCHE  
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DARMSTADT

### Complete Dockerfile for the minimal example

```
FROM ubuntu:focal

# Set timezone
RUN apt-get update --fix-missing && \
    DEBIAN_FRONTEND="noninteractive" apt-get -y install tzdata

# Install packages
RUN apt update && apt-get install --fix-missing -y \
    # Building
    build-essential cmake \
    # Version control
    git \
    # Python
    python3 \
    # Visualization
    python3-matplotlib python3-numpy \
    # Data analysis
    python3-pandas \
    # Test visualization
    jupyter-notebook jupyter-nbconvert \
    # Debugging the image
    vim

## Default Ubuntu to python3
RUN update-alternatives --install \
    /usr/bin/python python /usr/bin/python3 10
```

- The example Dockerfile installs all dependencies for the minimal example on Ubuntu 20.04.
- The installation commands would be different for another operating system.
- A more complex software (e.g. OpenFOAM) requires a larger Dockerfile.
- This lets us define the computing environments that are supported by the research software.

# (Continuous) Integration of scientific software

## Hands on: creating a Docker image VI



TECHNISCHE  
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### Building the image

```
%?> sudo docker build . \
    -f minimal-cse-ci-dockerfile_ubuntu-focal \
    -t minimal-cse-ci-dockerfile_ubuntu-focal
sudo docker build . -f minimal-cse-ci-dockerfile_ubuntu-focal -t minir
```

- ".": current directory
- "-f" name of the Dockerfile (defaults to "Dockerfile")
- "-t" tag (name) of the Docker image

# (Continuous) Integration of scientific software

## Hands on: creating a Docker image VII



TECHNISCHE  
UNIVERSITÄT  
DARMSTADT

### Listing Docker images

```
?> sudo docker image list
```

REPOSITORY	TAG	IMAGE	ID	CREATED	SIZE
minimal-cse-ci-dockerfile_ubuntu-focal	latest	921233ec4b44	9 minutes ago	982MB	

- The image is built on the machine (host) where the **docker build** command is called.
- Docker uses a so-called **image registry** to store images.
- For Continuous Integration the images are built on the machine where the tests are run or shared on **Dockerhub**.

# (Continuous) Integration of scientific software

## Hands on: creating a Docker image VIII



TECHNISCHE  
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**"Spinning a container"** (running a Docker image)

```
?> sudo docker run -it minimal-cse-ci-dockerfile_ubuntu-focal /bin/bash
root@b2c14ee0fd58:/# ls
bin boot dev etc home lib lib32 lib64 libx32 media mnt
opt proc root run sbin srv sys tmp usr var
root@b2c14ee0fd58:/# cd
root@b2c14ee0fd58:~# pwd
/root
```

- The container behaves just like a "regular" Ubuntu.
- **Jobs (test) commands for the Continuous Integration are checked/debugged inside a running container.**
  - ▣ Forgot to install a dependency.
  - ▣ The research software does not compile with installed dependencies.
  - ▣ ...

# (Continuous) Integration of scientific software

Hands on: creating a Docker image IX



TECHNISCHE  
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Working within the container : compiling the software

```
?> git clone https://gitlab.com/tmaric/minimal-cse-ci-examples.git
?> cd minimal-cse-ci-examples && mkdir build && cd build
?> cmake .. && make
?> ./myapp
```

The same steps will be done in the Docker container by the Continuous Integration

- Clone the repo.
- Build the software.
- Run the tests.

# (Continuous) Integration of scientific software

Hands on: creating a Docker image X



TECHNISCHE  
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DARMSTADT

## Analyzing the data using Jupyter notebooks

```
?> cd ..
```

```
?> jupyter nbconvert --execute mynotebook.ipynb --to html
```

- On the cluster, one would start the Jupyter notebook server and connect to it locally.
- Here the notebook is used to process the results and visualize secondary data as tables and diagrams.

# (Continuous) Integration of scientific software

Hands on: creating a Docker image XI



TECHNISCHE  
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Extracting the data from the container:

- Find the ID of the container you're on (execute on your machine)  
`sudo docker ps`
- Copy the results from the container onto the local machine (execute on your machine)  
`mkdir container-data`  
`sudo docker cp f2dff55edf7a:/root/minimal-cse-ci-examples \`  
`container-data/`
- Examine the data and the Jupyter notebook in a browser.

Note: the sequence f2dff55edf7a is system dependent ID, so it'll be different for you.



# (Continuous) Integration of scientific software

## Hands on: creating a Docker image XII



TECHNISCHE  
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- Saving the container or an image as a tar file

```
sudo docker commit f2dff55edf7a test:latest
```

- You can exit/close the container by pressing Ctrl+d.

- View the newly create image with 'name:tag' using

```
sudo docker image list
```

REPOSITORY	TAG	IMAGE ID	CREATED	SIZE
test	latest	f2dff55edf7a	About a minute ago	983MB

- Save the image into a tar file

```
sudo docker save test:latest -o container-archive.tar
```

- Load an image into Docker's registry to work with it

```
sudo docker load -i container-archive.tar
```

# (Continuous) Integration of scientific software

## Hands on: creating a Docker image XIII



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DARMSTADT

- Usually, the Docker image "lives" locally on the test machine.
- However, it can also be shared publicly on Dockerhub, for example (don't do this now)

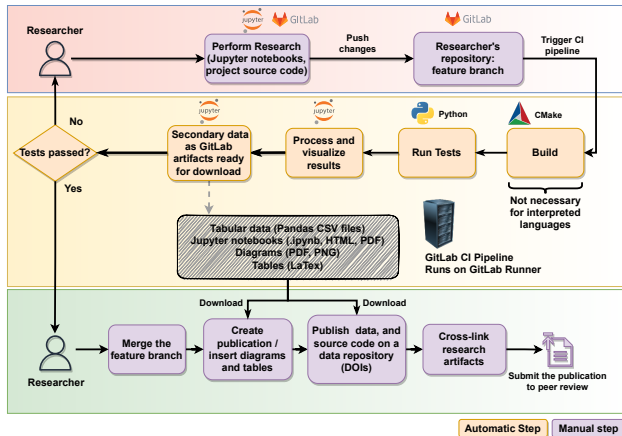
```
?> docker login
?> docker tag name:tag username/name:tag
?> docker push username/name:tag
```
- This image can now be used by everyone.
- Note: once you exit/stop a container all data/files created inside the container are discarded.

# (Continuous) Integration of scientific software

## Hands on: creating a Docker image XIV



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All the steps done so far manually using Docker, namely,

1. **building** the scientific software,
2. **running tests**,
3. **processing data**
4. **exporting** the data and Jupyter notebooks,

are automated by Continuous Integration, that uses Docker for encapsulating the computing environment.

# (Continuous) Integration of scientific software

Hands on: overview



TECHNISCHE  
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Define tests, how and when they are executed and what results to store.

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Provide a machine for execution of tests.

# (Continuous) Integration of scientific software

Hands on: enabling CI for a GitLab project



TECHNISCHE  
UNIVERSITÄT  
DARMSTADT

In the **minimal-cse-ci-examples** repository

```
?> git checkout added-dockerfile  
?> git checkout -b feature/enable-ci
```

# (Continuous) Integration of scientific software

Hands on: enabling CI for a GitLab project I



TECHNISCHE  
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DARMSTADT

- Adding the **.gitlab-ci.yml** file your project and pushing the change to the GitLab remote repo configures the CI pipeline.
- The YAML file specifies the Docker image that is used for testing  
**image:** "tmaric/minimal-cse-ci:ubuntu-focal"

## **stages:**

- building
- running
- visualization
- and the so-called job **stages**: collections of jobs for building, running tests and visualization.
- For example, the **building** stage may multiple jobs, building the software for
  - ▣ production,
  - ▣ debugging,
  - ▣ performance measurements.

# (Continuous) Integration of scientific software

Hands on: enabling CI for a GitLab project II



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- The building stage in the YAML file defines build jobs like this one

**build:**

**stage:** building

**script:**

- git clone https://gitlab.com/tmaric/minimal-cse-ci-examples.git
- cd minimal-cse-ci-examples && mkdir build && cd build
- cmake ..
- make

**artifacts:**

**paths:**

- minimal-cse-ci-examples/mynotebook.ipynb
- minimal-cse-ci-examples/build/myapp

- where the repository is cloned and built with specific options.
- For example **cmake -DCMAKE\_BUILD\_TYPE=Debug** can set up the build for debugging.
- **artifacts** are downloadable files passed on to other jobs.

# (Continuous) Integration of scientific software

## Hands on: enabling CI for a GitLab project III



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- The running stage in the YAML file defines how simulations (studies) run

```
param_study:  
  stage: running  
  dependencies:  
    - build  
  
  script:  
    - cd minimal-cse-ci-examples/build && ./myapp  
  
  artifacts:  
    paths:  
      - minimal-cse-ci-examples/mynotebook.ipynb  
      - minimal-cse-ci-examples/build/myapp  
      - minimal-cse-ci-examples/build/poly-data.csv
```

- Without a successful **build**, simulations do not run.
- Here the artifacts are the secondary data and the notebooks that visualize them.



# (Continuous) Integration of scientific software

Hands on: enabling CI for a GitLab project IV



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- The **visualization** stage in the YAML file saves time by converting Jupyter notebooks

**convert\_notebooks:**

**stage:** visualization

**dependencies:**

- param\_study

**script:**

- cd minimal-cse-ci-examples
- jupyter nbconvert mynotebook.ipynb --execute --to html

**artifacts:**

**paths:**

- minimal-cse-ci-examples/mynotebook.\*
- minimal-cse-ci-examples/build/myapp
- minimal-cse-ci-examples/build/polydata.csv

- HTML is easiest, other formats are available (PDF, markdown,...).
- HTML notebooks can be **viewed in the browser**.

"Continuous" Integration of Scientific Software(in Computational Science and Engineering) -

T. Marić, T. Tolle, J.P. Lehr, I. Pappagianidis, B. Lambie, D. Bothe, C. Bischof

# (Continuous) Integration of scientific software

Hands on: enabling CI for a GitLab project V



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## Lessons learned I

- Defining artifacts path starts at **your-project/**.
- YAML files require debugging:
  - ▣ syntax: use GitLab's CI Lint tool
  - ▣ everything else: the only way to do this effectively is to commit changes and push them upstream.
- It is possible to partially debug locally using `gitlab-runner exec docker job-name` but this does not work with artifacts and dependencies.

Final **.gitlab-ci.yml** file.

# (Continuous) Integration of scientific software

Hands on: enabling CI for a GitLab project VI



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## Lessons learned II

- Generally, and for the CI, scripts that reproduce data without requiring input for the users speed up work.  
`simulation-directory > ./reproduce-density-ratio-data`
- It takes time to set up the CI, but it pays off in debugging time as problems are found automatically.
- Exporting `*.ipynb` jupyter notebooks and their data

Final **.gitlab-ci.yml** file.

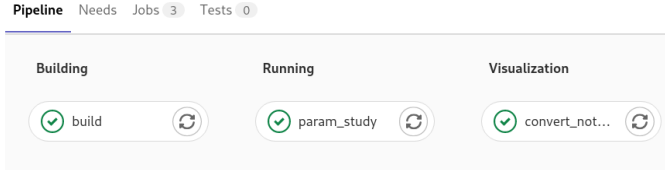
# (Continuous) Integration of scientific software

Hands on: enabling CI for a GitLab project VII



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## The CI pipeline of the Minimal Working Example (MWE) repository



# (Continuous) Integration of scientific software

Hands on: overview



TECHNISCHE  
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Provide a machine for execution of tests.

# (Continuous) Integration of scientific software

Hands on: setup a GitLab runner I (why a self-managed runner)



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An incomplete comparison:

## Self-managed runner

- No shared runners available
- Provided CI/CD minutes of plan insufficient (e.g. 400 min per month for GitLab's free plan)
- Control over hardware and runner configuration

## Shared runners

- No need to provide "always on" hardware
- No need for maintenance

Overall: require less of your time

# (Continuous) Integration of scientific software

Hands on: setup a GitLab runner II (install GitLab runner)



TECHNISCHE  
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Using instructions from [GitLab documentation](#) for Ubuntu:

1. `?> curl -L \`  
`"https://packages.gitlab.com/install/repositories/runner/gitlab-runner/script.deb.sh" \`  
`| sudo bash`
2. `?> sudo apt-get install gitlab-runner`

Check the status of the runner:

- `?> sudo systemctl status gitlab-runner.service`

The output should indicate that it is active:

```
CSI\tolle@wmpc82:~$ sudo systemctl status gitlab-runner.service
● gitlab-runner.service - GitLab Runner
   Loaded: loaded (/etc/systemd/system/gitlab-runner.service; enabled; vendor preset: enabled)
   Active: active (running) since Mon 2021-09-20 15:59:03 CEST; 20h ago
     Main PID: 327927 (gitlab-runner)
        Tasks: 37 (limit: 154341)
       Memory: 15.3M
      CGroup: /system.slice/gitlab-runner.service
              └─327927 /usr/bin/gitlab-runner run --working-directory /home/gitlab-runner --config
```

# (Continuous) Integration of scientific software

Hands on: setup a GitLab runner III (register GitLab runner)



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Follow GitLab documentation on [how to register a runner](#):

- Obtain a token for project-specific runner: go to your fork of the *minimal-cse-ci-examples* on [gitlab.com](#) and then to **Settings > CI/CD** and expand the **Runners** sections.
- There you find a section **Specific runners** and aforementioned token.

Register your runner (instructions for Linux):

- `?> sudo gitlab-runner register`

You need to provide some information regarding your runner, e.g. your project's token. See next slide.



# (Continuous) Integration of scientific software

Hands on: setup a GitLab runner IV (register GitLab runner)



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Option	Value
GitLab instance URL	https://gitlab.com/
Token	Obtained from the project on GitLab, see previous slide
Runner description	describe the machine used as runner, useful to distinguish multiple runners
Tags	leave empty, not required here. Useful for advanced pipelines
Runner executor	docker (see <a href="#">here</a> for comparison of executors.)
Default image	Because we chose docker as executor: name of the default Docker image

You should now see your runner under

*Available specific runners:*

## Available specific runners

● #10593581 (cfxPeNcz) 🔒

✎ || Remove runner

Furnace (Threadripper 64 core workstation)



## Interaction between Transport and Wetting Processes

Funded by the German Research Foundation (DFG) – Project-ID 265191195 – **CRC 1194** : Z-INF