



UNIVERSITY OF ICELAND  
SCHOOL OF ENGINEERING AND NATURAL SCIENCES  
FACULTY OF INDUSTRIAL ENGINEERING,  
MECHANICAL ENGINEERING AND COMPUTER SCIENCE



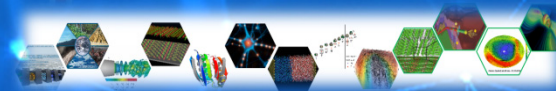
# CoE RAISE – Role of MLOps

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Juelich Supercomputing Centre, Forschungszentrum Juelich, Germany  
*2021-09-30, RAISE CoE Seminar MLOps with ClearML, Online*



IHPC National Competence Center  
(NCC) for HPC & AI in Iceland



@ProfDrMorrisRiedel



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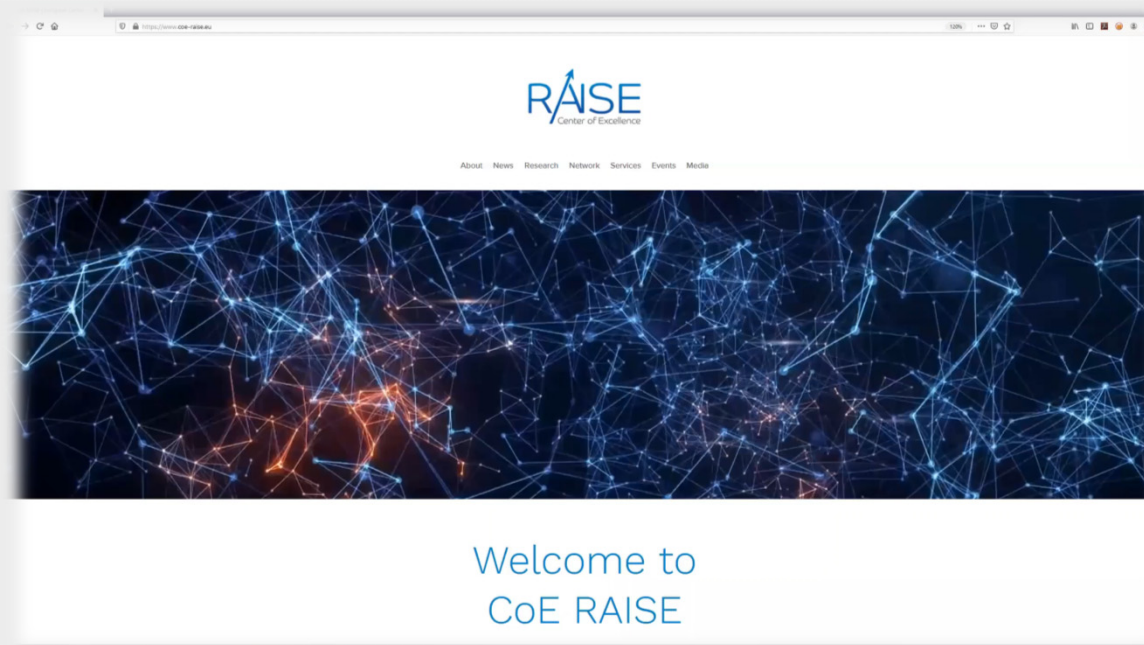


<https://www.youtube.com/channel/UCWC4VKHmL4NZgFfKoHtANKg>



[morris@hi.is](mailto:morris@hi.is)

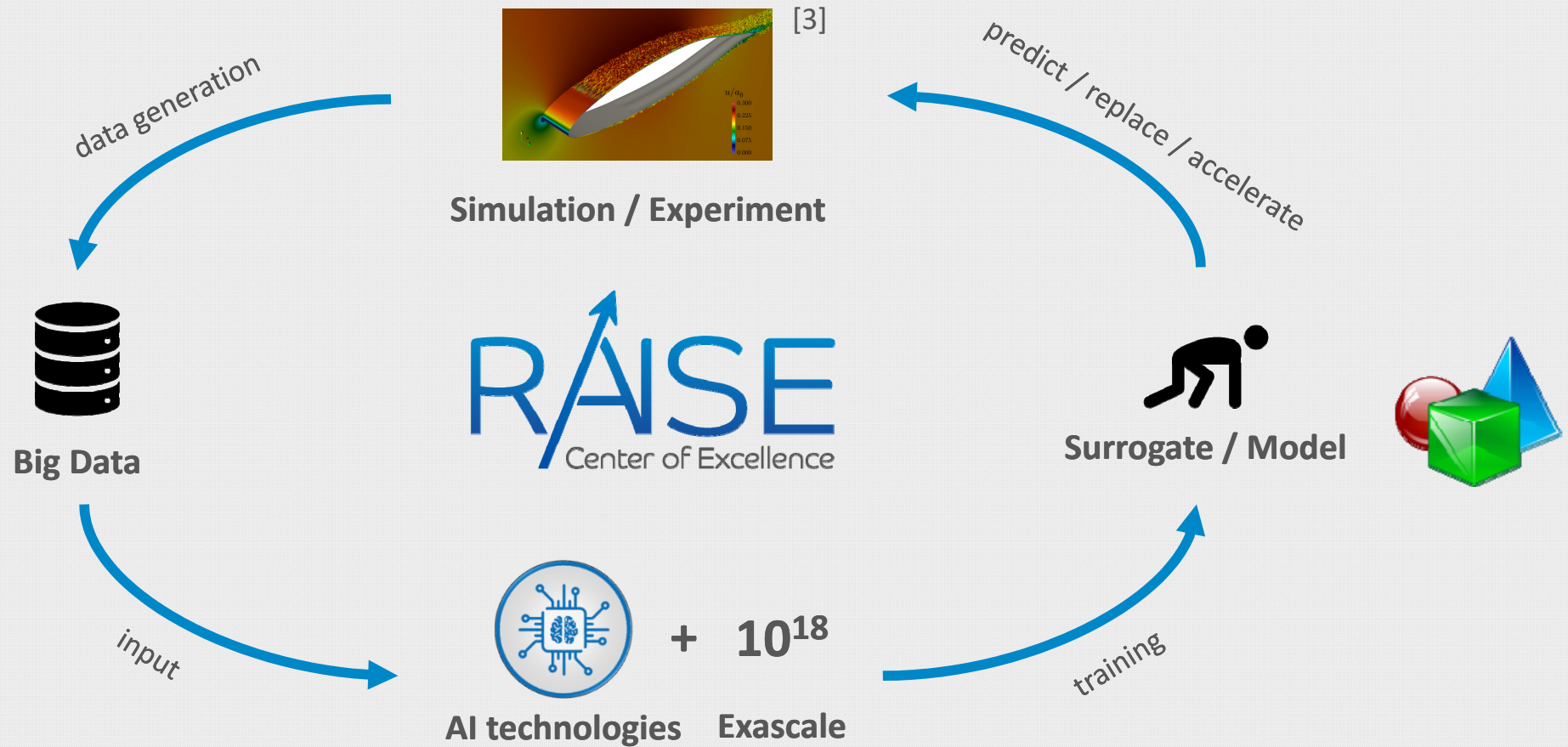
# CoE RAISE Web Page & More Information



<https://www.coe-raise.eu>

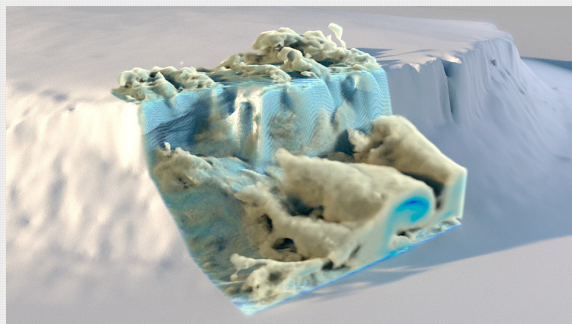
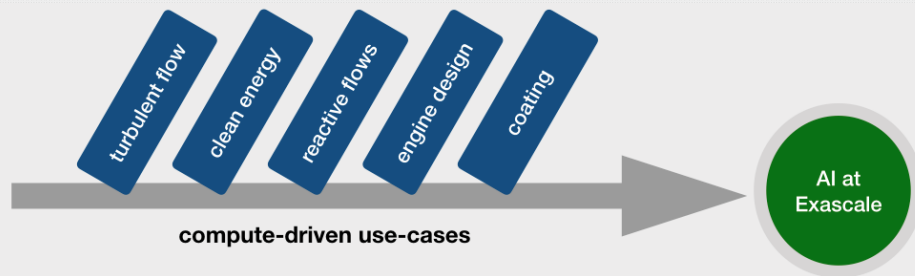


# CoE RAISE – Motivation & Approach

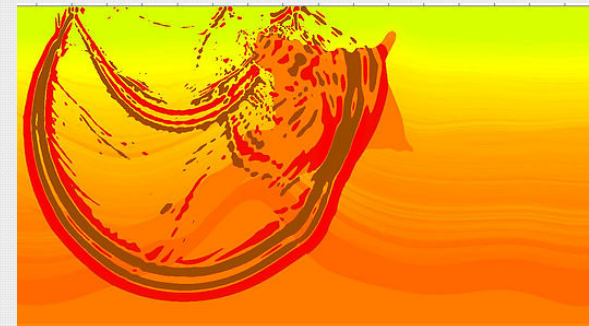
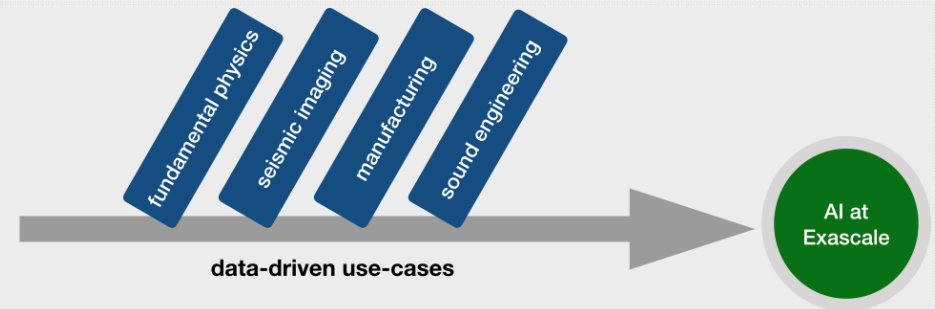


# Use Cases in CoE RAISE

➤ Two kinds of use cases:

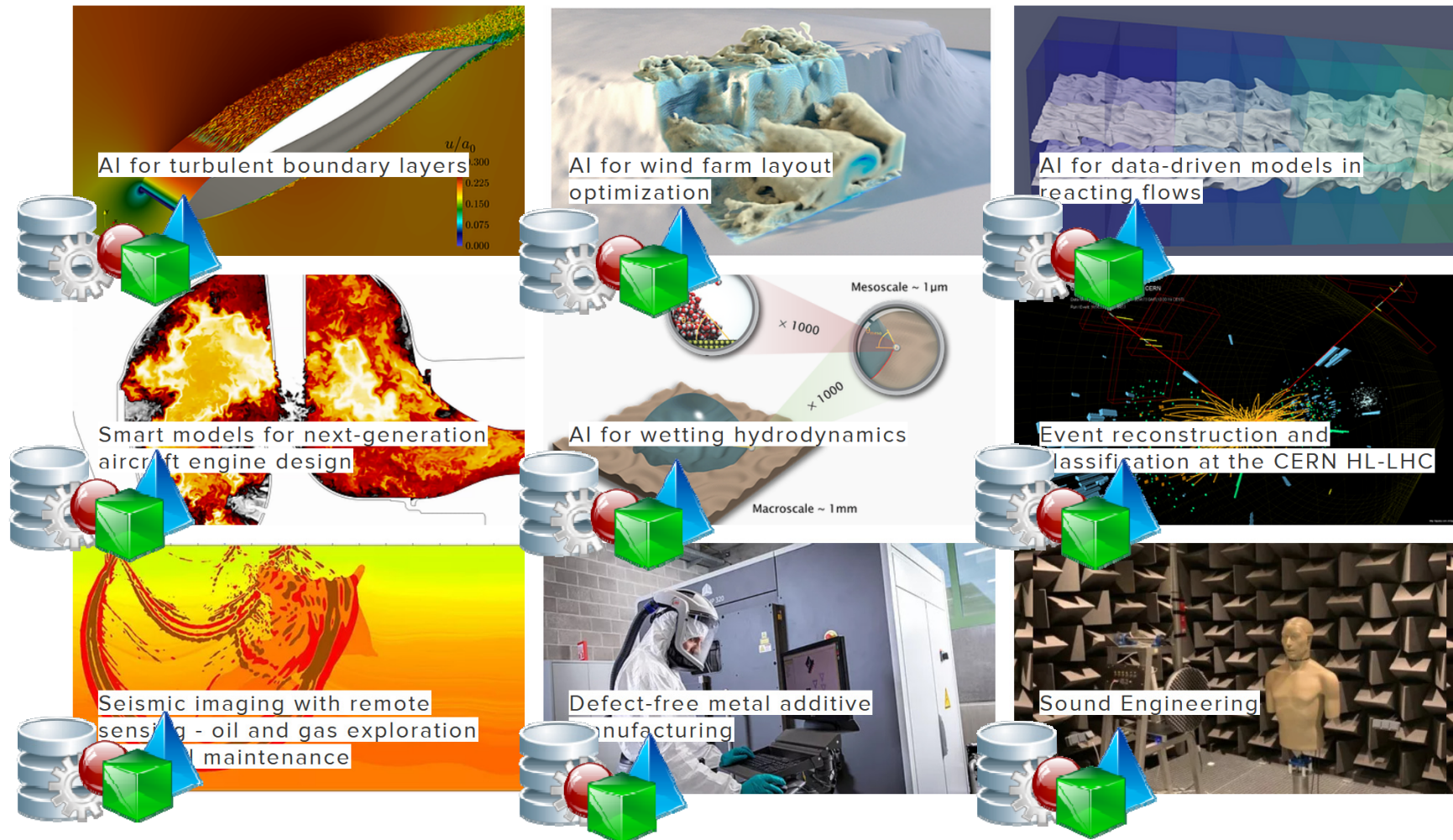


Example from use case "AI for wind farm layout": Turbulence generated by a cliff on Bolund Island, Denmark.



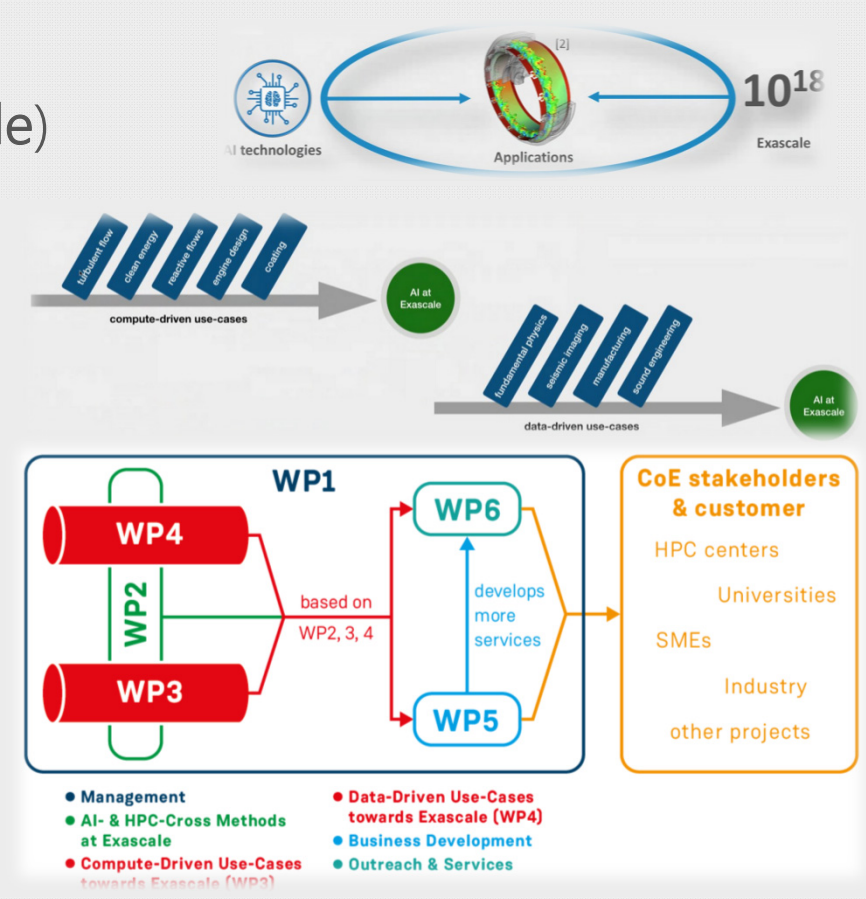
Example from use case "Seismic imaging with remote sensing - oil and gas exploration and well maintenance": Snapshot from a wavefield.

# Compute- and Data-driven Use Cases – Use & Generate Data

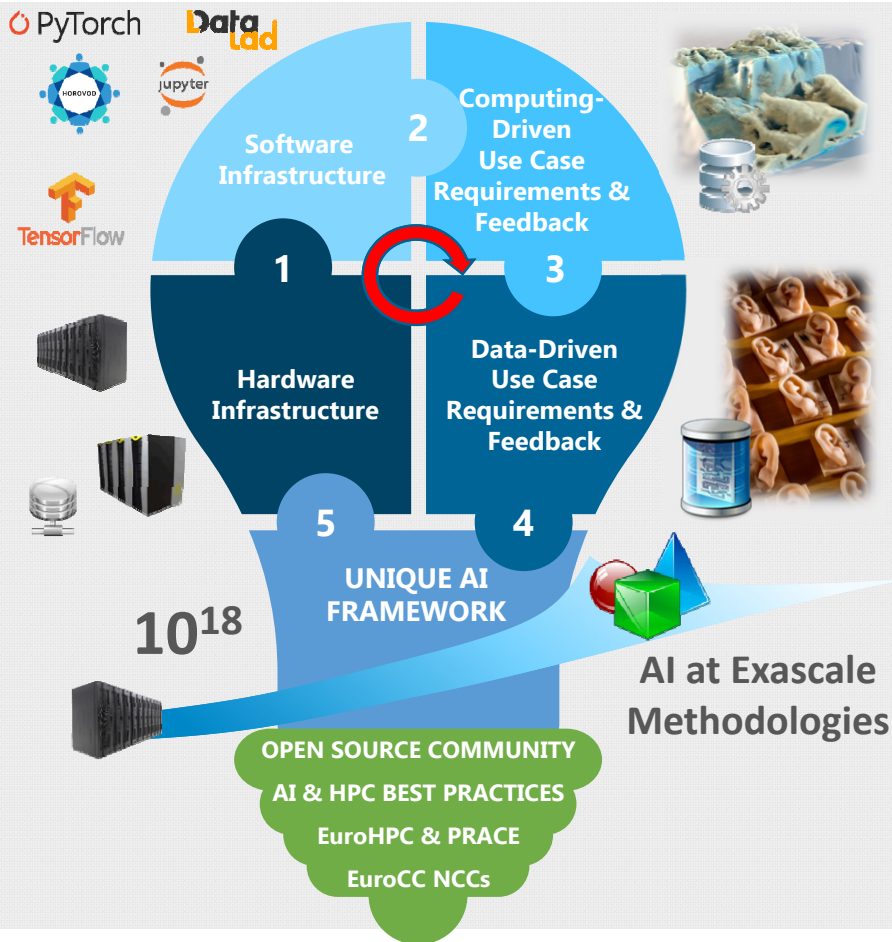


# WP2 – AI- & HPC-Cross Methods at Exascale in a nutshell

- WP3 (Compute-Driven Use-Cases towards Exascale)
- WP4 (Data-Driven Use-Cases towards Exascale)
- Developments in these WPs will be supported by the cross-linking activities of WP2
  - E.g. scaling machine & deep learning codes with frameworks like Horovod/Deepspeed
  - E.g. introduction to new AI methods such as Long-Short Term Memory (Time series)
  - E.g. data augmentation approaches
  - E.g. benchmarking HPC machines and offer also pre-trained AI algorithms (i.e., transfer learning)
  - E.g. offer neural architecture search methods for hyperparameter – tuning in semi-automatic way



# Towards AI & HPC at Exascale with CoE RAISE Results



## Hardware Infrastructure

Prepare & Document available production systems at partners' HPC centers

Examples: JUWELS (JUELICH), LUMI (UoICELAND), DEEP Modular Prototypes, JUNIQ (JUELICH), etc.

## Software Infrastructure

Prepare & Document available open source tools & libraries for HPC & AI useful for implementing use cases

Examples: DeepSpeed and/or Horovod for interconnecting N GPUs for a scalable deep learning jobs

## Computing-driven Use Cases Requirements & Feedback

Use cases with emphasize on computing bring in co-design information about AI framework & hardware

Examples: Use feedback that TensorFlow does not work nicely, so WP2 works with use cases on pyTorch

## Data-driven Use Cases Requirements & Feedback

Use cases with emphasize on data bring in co-design information about AI framework & hardware

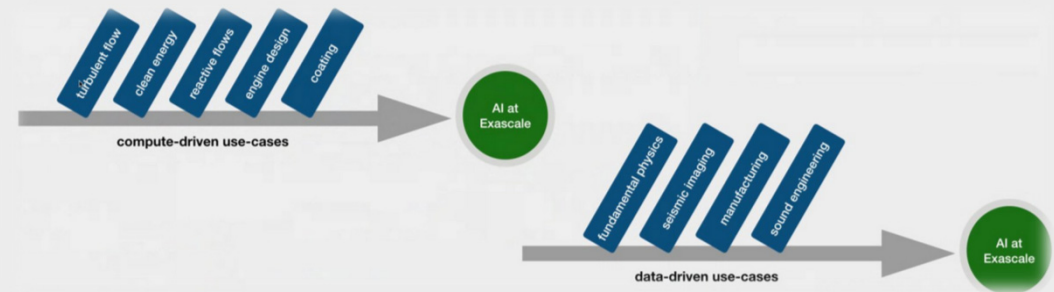
Examples: Deployment blueprint by using AI training on cluster module & inference/testing on booster

## → UNIQUE AI FRAMEWORK

Living design document & software framework blueprint for using HPC & AI offering also pretrained AI models

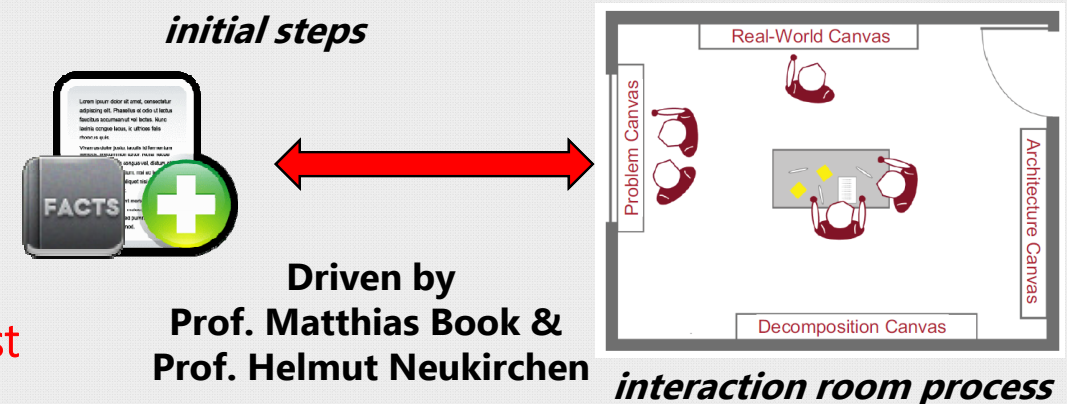
## ➤ Fact Sheets

- Foster initial understanding
- Living document & each Fact Sheet per WP3/WP4 Use Case
- *(Experience from many other EU projects)*



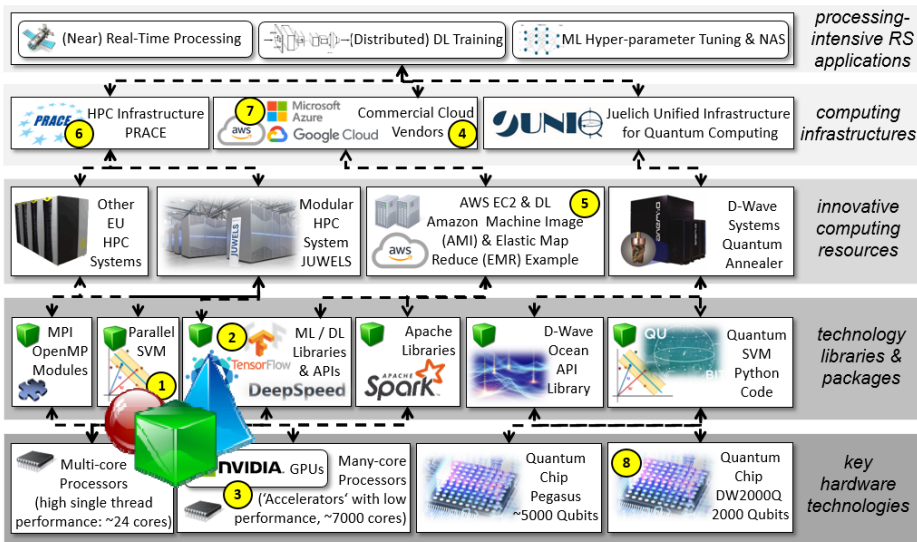
## ➤ Selected Contents

- Short Application Introduction
- Clarify Primary Contacts
- Codes/Libraries/Executables
- HPC System Usage Details
- Specific Platforms & 'where is what data'?
- **Machine/Deep Learning Approaches of Interest**





# Fact Sheet Process of CoE RAISE & Early Co-Design Examples

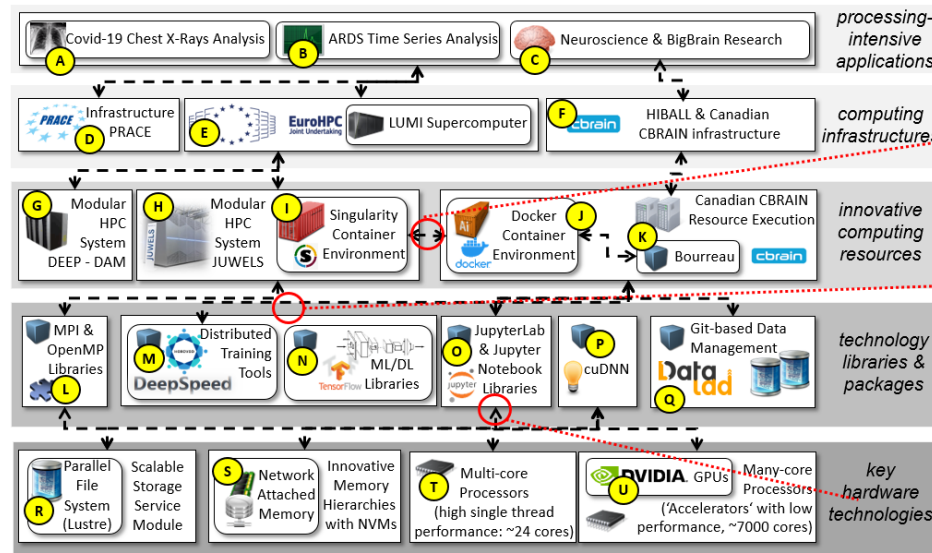


- Parallel ML implementations still rare (MPI/OpenMP)
  - Open source tools good, but all need to fit in versions
  - Using very many GPUs beyond NVlink could be tricky
  - Look & feel of CC vendor ML services differ significantly
  - Costs of GPUs of CC vendors (e.g., EC2) tough, 24\$/hour
  - GPU hours are free, but requires time grant proposal
  - Free GPUs in Google Colab vary in the available types
  - Works not yet with multi-class problems & large data
- Legend:**
- (N) Highlighted Challenges & Experiences

Riedel, M., Cavallaro, G., Benediktsson, J.A.: Practice and Experience in using Parallel and Scalable Machine learning in Remote Sensing from HPC over Cloud to Quantum Computing, in conference proceedings of the IEEE IGARSS Conference, Brussels, Belgium, 2021, Physical and Online event, to appear <https://igarss2021.com/>



Riedel, M., Sedona, R., Barakat, C., Einarsson, P., Hassanian, R., Cavallaro, G., Book, M., Neukirchen, H., Lintermann, A.: Practice and Experience in using Parallel and Scalable Machine learning with Heterogenous Modular Supercomputing Architectures, in conference proceedings of the IEEE IDPS Conference, Heterogenous Computing Workshop (HCW), Portland, USA, 2021, Online, to appear <https://www.ipdps.org/>



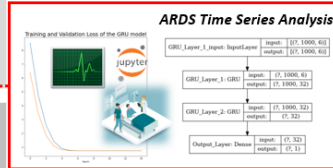
```

Some preparation
$ mkdir -p winterschool_cache winterschool_tmp
$ chmod -w winterschool_cache
$ export SINGULARITY_CACHEDIR=$(mktemp -d -p "$(pwd)/winterschool_cache")
$ export SINGULARITY_TMPDIR=$(mktemp -d -p "$(pwd)/winterschool_tmp")

Pull the docker image:
$ cd winterschool
$ singularity pull hus.sif docker://glatland/DataLad

Step into the container:
$ singularity shell --hus.sif
(the prompt changes to '$$singularity$')

download a dataset:
$ git config --global user.name "Your name"
$ git config --global user.email "peturheig@gmail.com"
$ singularity dataset install https://github.com/COMP-PCMB/comp-dataset.git
    
```

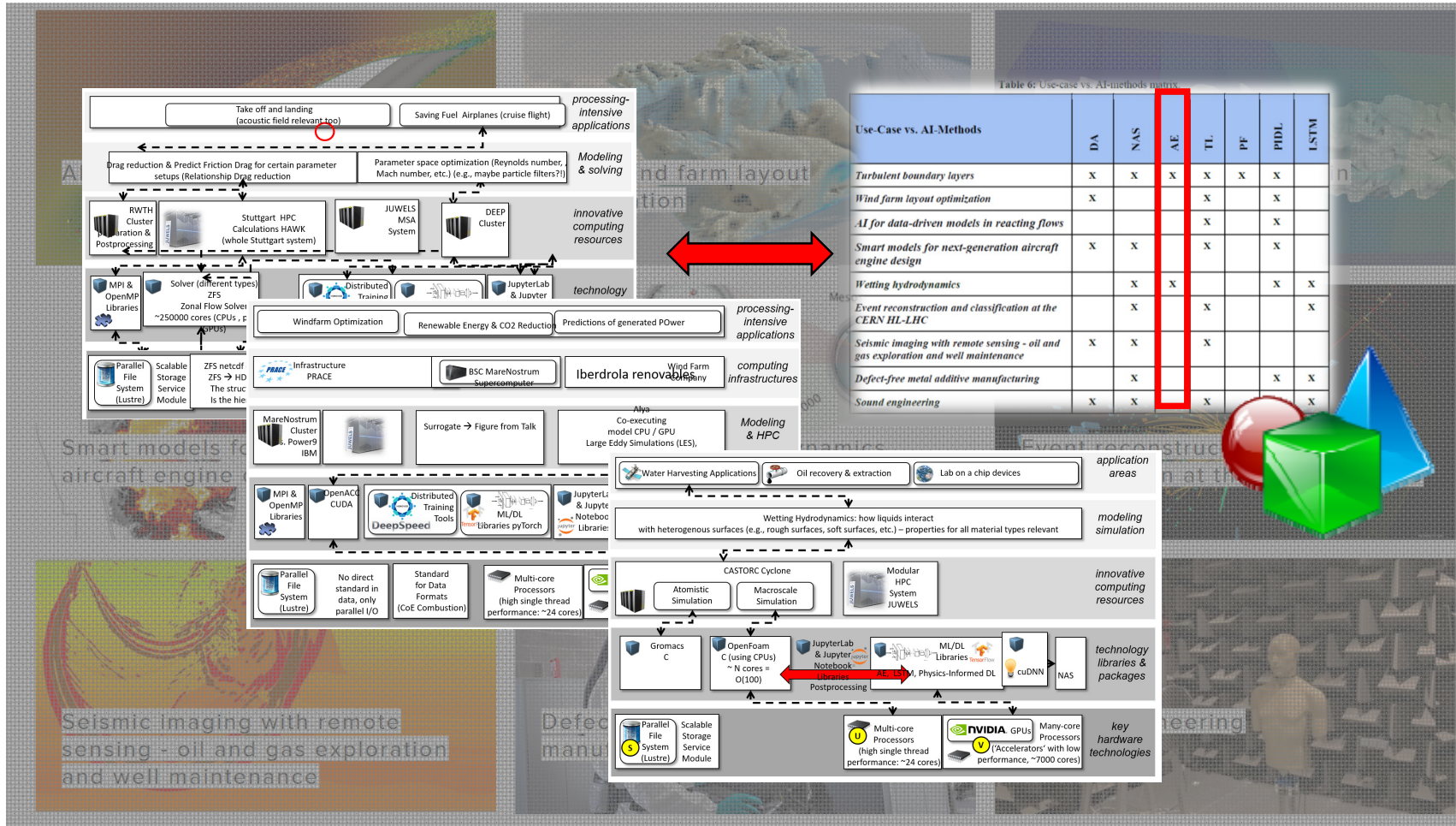


```

# /bin/bash
# load required modules
module purge
module use $SHENSTAGES
module load Stages/2020
module load GCC/gcc/5.3.0
module load Python/3.8.5
module load Tensorflow/1.15.1-python-3.8.5
module load OpenCV/3.4.1-python-3.8.5
# activate python virtual environment
source /project/raising2021/ig3/fson3/jupyter/kerml3/ig3/activate
# future python packages installed in the virtual environment are always preferred
export PYTHONPATH=/project/raising2021/ig3/fson3/jupyter/kerml3/ig3/python
python -w jupyterlab
    
```



# Compute- and Data-driven Use Cases Fact Sheets – Drafts(!)

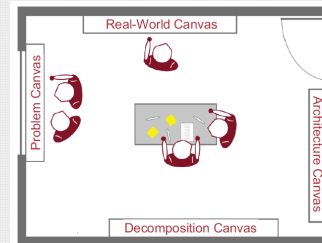


**WORK  
IN  
PROGRESS**



## ➤ CoR RAISE Interaction Room Process as Next Step

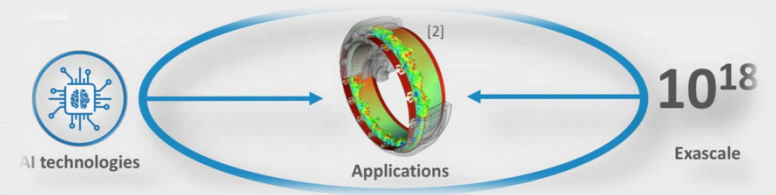
- Supports the proper software engineering design of the unique AI framework blueprint
- Expecting to work with WP3 & WP4 experts in an open minded way
- Process will be guided by Prof. Dr. Matthias Book (University of Iceland)
- Supported by Software Engineering & testing expert Prof. Dr. Helmut Neukirchen (University of Iceland)
- CoE RAISE @ YouTube: <https://www.youtube.com/channel/UCAdIZ-v6cWwGdapwYxdN7dg>
- **Methology as one CoE RAISE outcome**



### HPC Systems Engineering in the Interaction Room

Matthias Book

with Morris Riedel, Jülich Supercomputing Centre / UoI and Helmut Neukirchen, University of Iceland

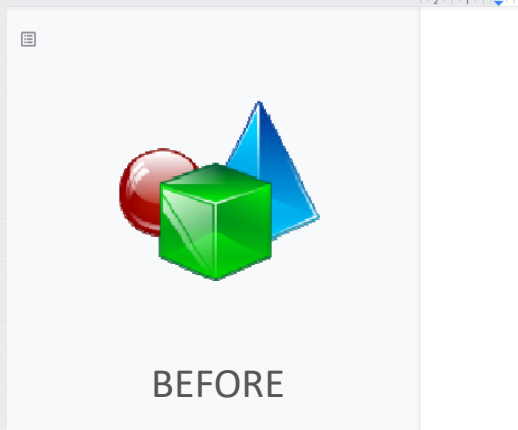


Book, M., Riedel, M., Neukirchen, H., Goetz, M.: [Facilitating Collaboration in High-Performance Computing Projects with an Interaction Room](#), in conference proceedings of the 4th ACM SIGPLAN International Workshop on Software Engineering for Parallel Systems (SEPS 2017), October 22-27, 2017, Vancouver, Canada

# RAISE Initial Identified AI/HPC Methods (Milestone M7)



Continuously Updating



**NEW**

H2020-INFRAEDI-2018-2020



CoE RAISE

Center of Excellence "Research on AI- and Simulation-Based Engineering at Exascale"

Grant Agreement Number: 951733

MS2

AI/HPC Methods

Draft



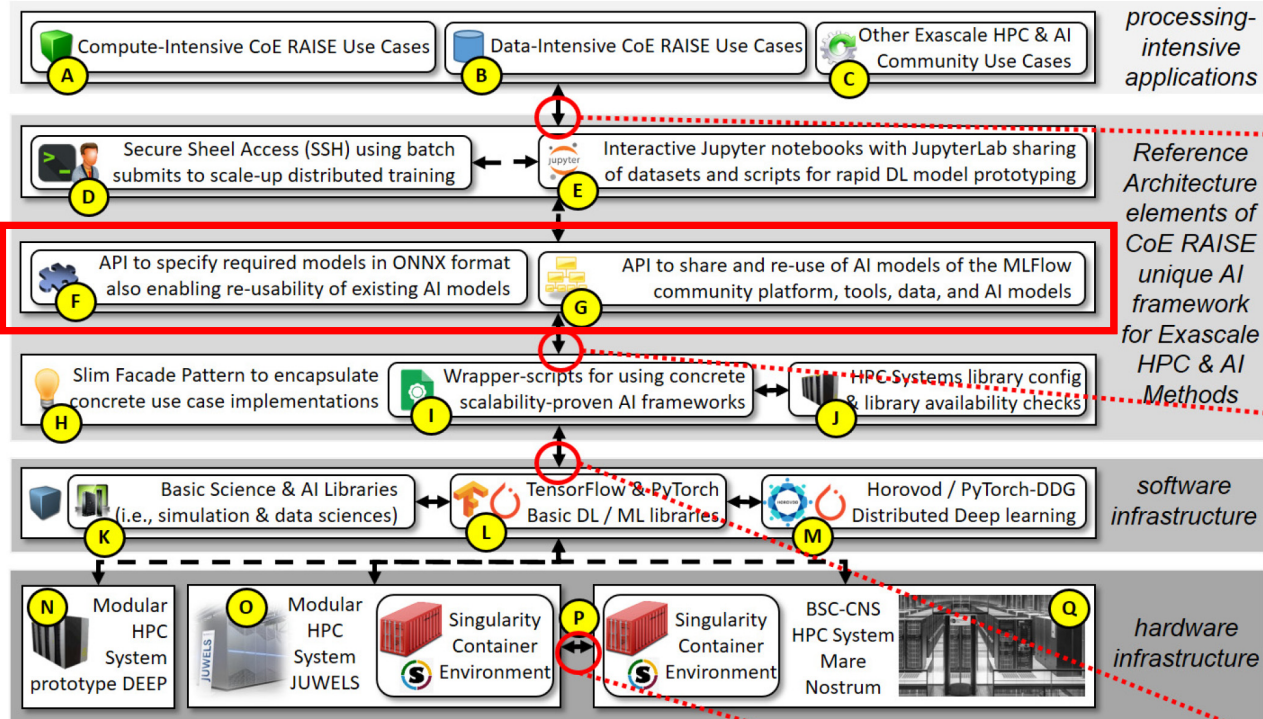
Table 6: Use-case vs. AI-methods matrix.

Use-Case vs. AI-Methods	DA	NAS	AE	TL	PF	PDDL	LSTM
Turbulent boundary layers	X	X	X	X	X	X	
Wind farm layout optimization	X			X	X	X	
AI for data-driven models in reacting flows				X	X	X	
Smart models for next-generation aircraft engine design	X	X		X		X	
Wetting hydrodynamics		X	X			X	X
Event reconstruction and classification at the CERN HL-LHC		X		X			X
Seismic imaging with remote sensing - oil and gas exploration and well maintenance	X	X		X			
Defect-free metal additive manufacturing		X				X	X
Sound engineering	X	X		X			X

Use Case	AE	PIML	ANNs	CNN	NO	SMs	GNN	IN	LSTM	GRU		
<b>Details</b>	CAE		RBF-ANN	U-Net	RESNET	FNO	AR	ARMA	ARIMA		JEDI-net	
AI for turbulent boundary layers	X	X										
AI for wind farm layout optimization			X				X	X	X			
AI for data-driven models in reacting flows				X						X		
Smart models for next generation aircraft engine design				X						X		
AI for wetting hydrodynamics					X							
Event reconstruction and classification at the CERN HL-LHC use case										X	X	
Seismic imaging with remote sensing for energy applications	X				X							
Detect-free metal additive manufacturing	X				X							
Sound Engineering											X	X



# MLOps Platforms relevant in RAISE Unique AI Framework for Exascale



*processing-intensive applications*

*Reference Architecture elements of CoE RAISE unique AI framework for Exascale HPC & AI Methods*

*software infrastructure*

*hardware infrastructure*

**Legend:**  
 Tangible outputs of RAISE WP2 as part of the unique AI framework layout

✓ RQ6, RQ7, RQ8, RQ9  
 ❖ Part of the framework layout plan is to provide containers in Singularity with prepackaged datasets & software stacks needed for AI agnostic to hardware & good I/O performance

✓ RQ1, RQ2, RQ4, RQ5  
 ❖ Parts of the framework layout plan is to provide Kernels for Jupyter notebooks with correct version setups of modules for specific HPC Systems

✓ RQ3, RQ6  
 ❖ Parts of the framework layout plan is to provide a lightweight and abstract Python API building on ONNX enabling also exchanges via MLFlow/ClearML

✓ RQ1, RQ2, RQ8, RQ9  
 ❖ Parts of the framework layout plan is to provide a lightweight Python API that abstracts from low level versioning of AI packages (with proven scalability) and is harmonized with different available HPC system module versions

**NEW**

**DRAFT**

**Continuously Updating**

drive. enable. innovate.



The CoE RAISE project receives funding from the European Union's Horizon 2020 – Research and Innovation Framework Programme H2020-INFRAEDI-2019-1 under grant agreement no. 951733