

Artificial Intelligence for Cold Regions (AI-CORE)

a Pilot to bridge Data Analytics and Infrastructure Development

Long Phan, Julia Christmann, Martin Rückamp

Angelika Humbert, Stephan Frickenhaus, Tilman Dinter

ML for Earth System Modelling and Analytics workshop 04.05.2021

HGF initiative „Helmholtz Incubator, Information & Data Science“

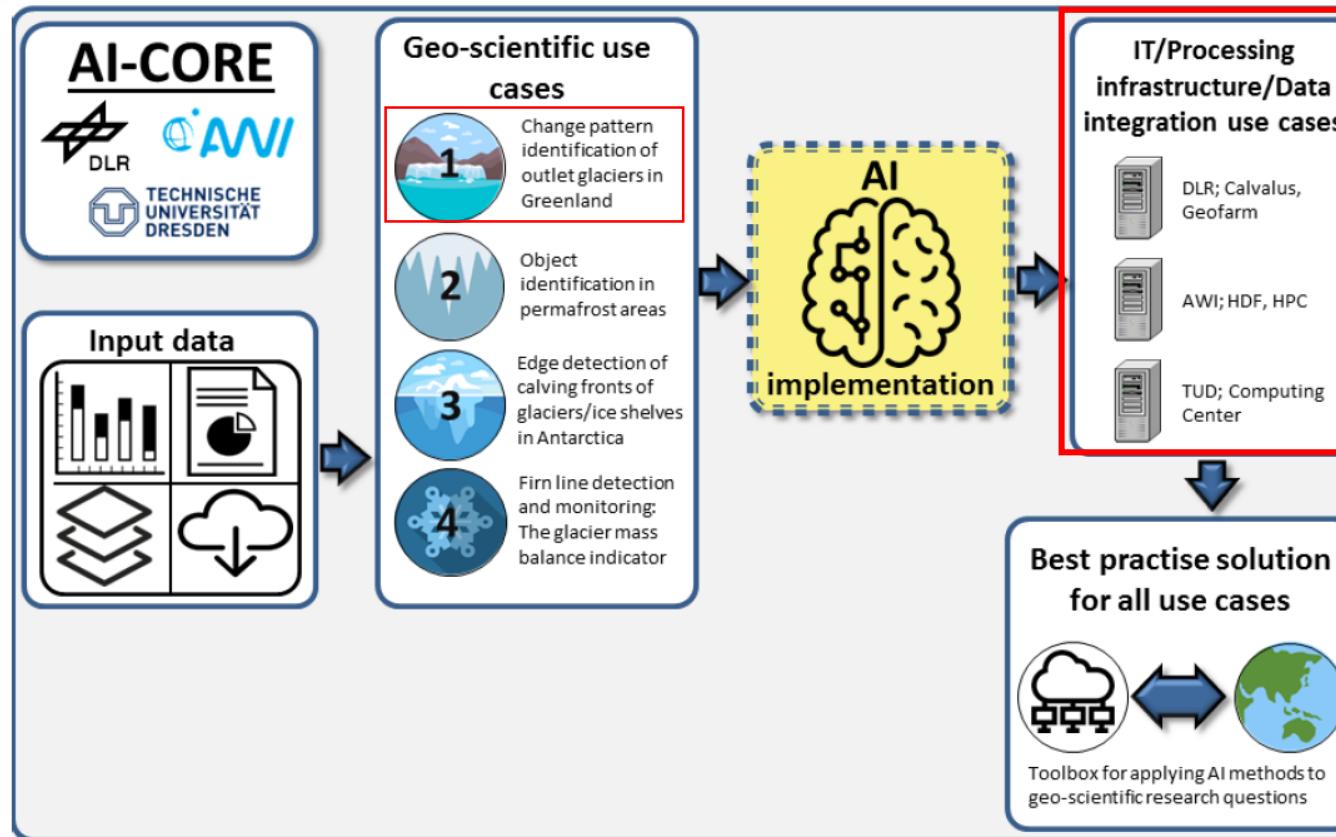


Figure 1: Workflow of AI-CORE

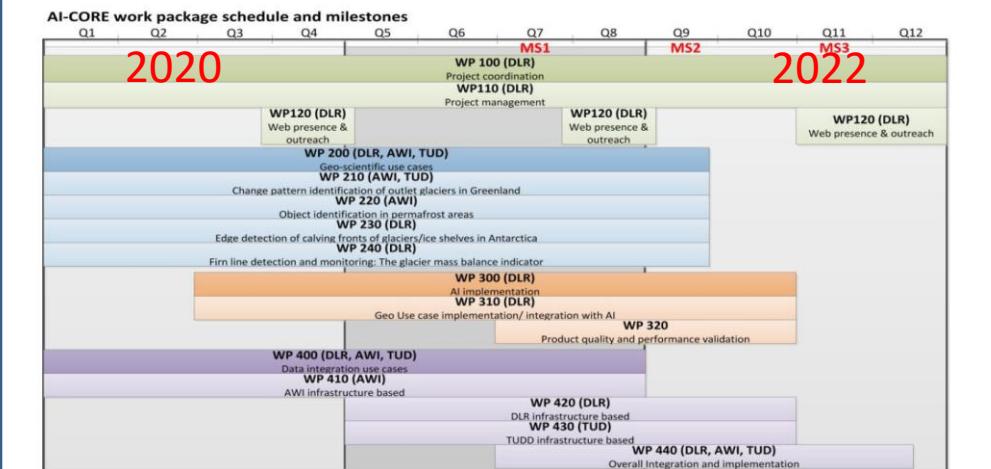


Figure 2: AI-CORE work package schedule and milestones. Partners leading an activity are included in brackets after the work package number

Experimental design for marine ice sheet-ocean model: MISMIP+

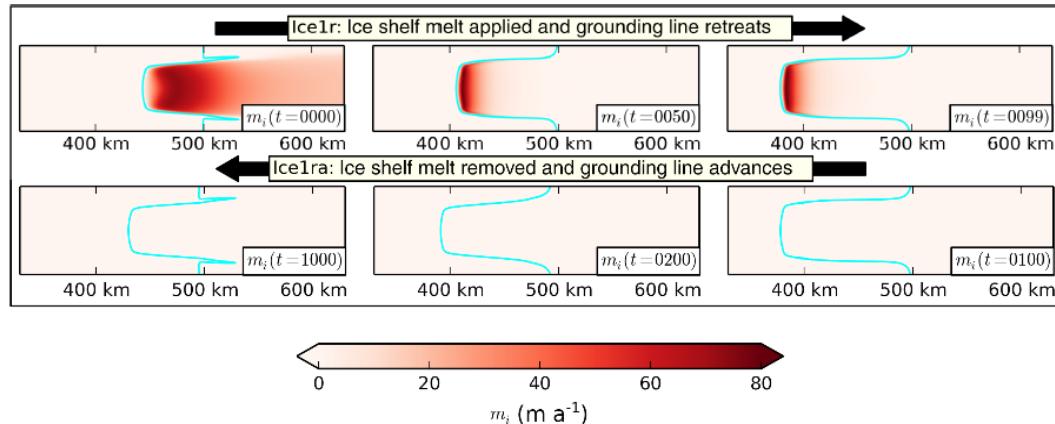
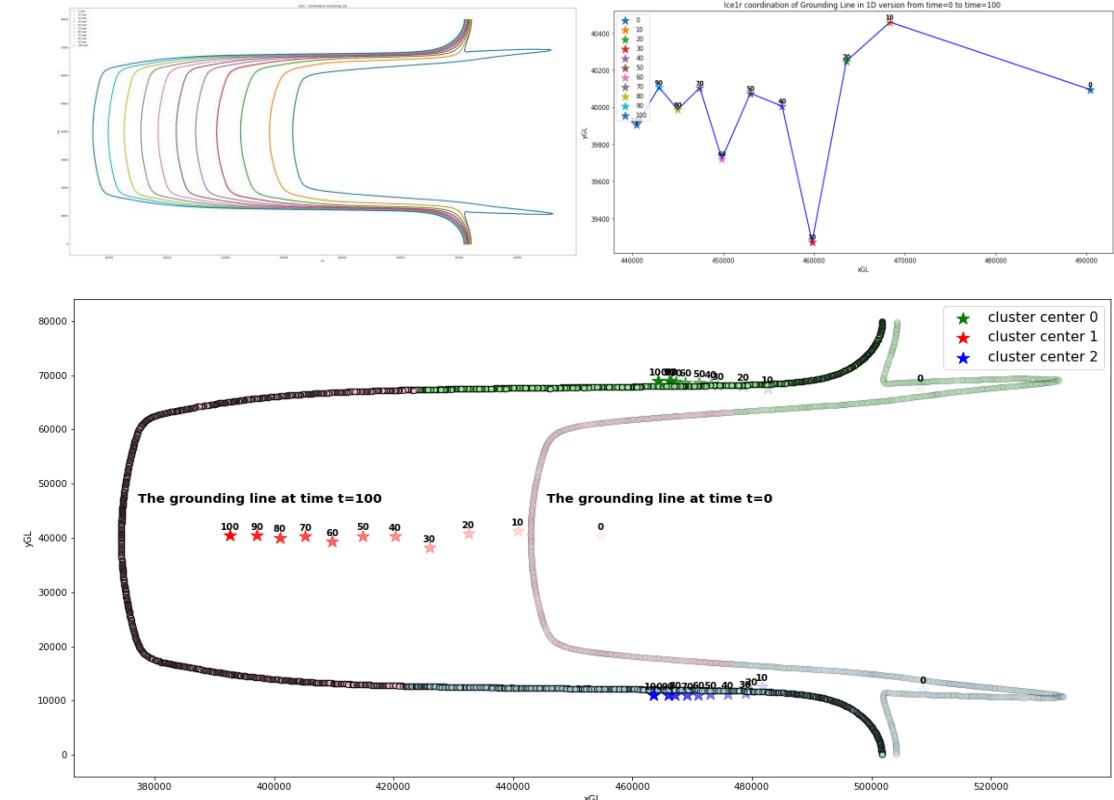


Figure: ice shelf melt rate m_i fields during the Ice1r and Ice1ra experiments from a BISICLES run. Melt rates are applied when $0 < t < 100$ a, causing the ice shelf to thin and grounding line to retreat. Once $t > 100$ a, no melt is applied, the ice shelf thickens, and the grounding line advances*

Aim: Clustering regions of small, middle and high change of grounding line migration with time.

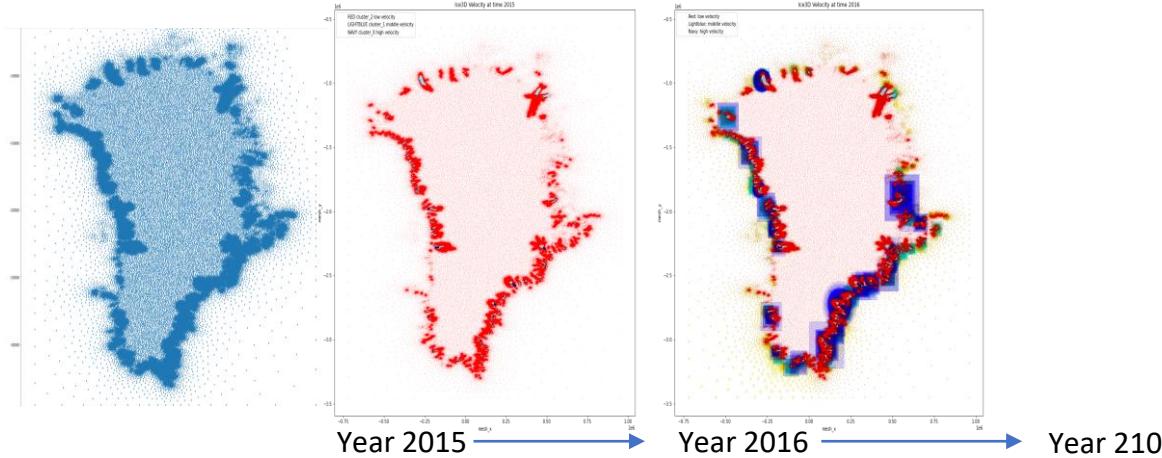
Change pattern identification with Descriptive Analytics, Clustering K-Means



*Source: Experimental design for three interrelated marine ice sheet and ocean model intercomparison projects: MISMIP v. 3 (MISMIPC), ISOMIP v. 2 (ISOMIPC) and MISOMIP v. 1 (MISOMIP1), 2016, Asay-Davis et al.

Geoscientific Use-case 1 - Greenland

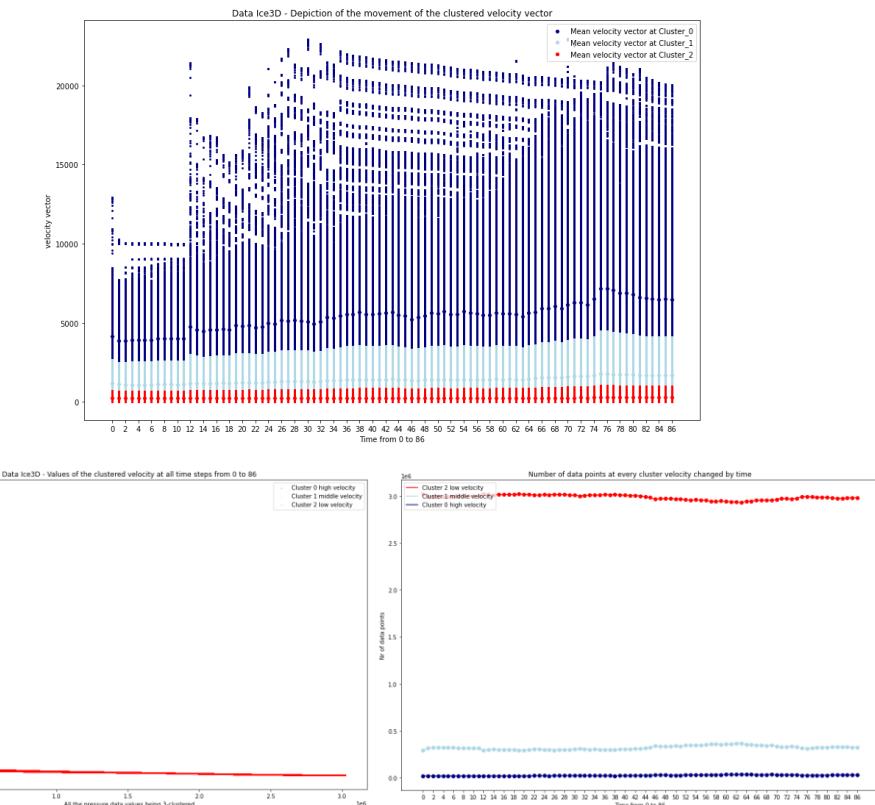
Sensitivity of Greenland ice sheet projections to spatial resolution: ISMIP6



The dataset was initially generated from the simulations in the framework of the Ice Sheet Model Intercomparison Project for CMIP6 (ISMIP6) (Goelzer et al., 2020, Rückamp et al., 2020)*. The Clustering approach is hereby re-applied, and extended to observe the changes of the positions in term of **velocity**, ice mask, pressure, etc. in Greenland.

Aim: Analyse and detect the temporal change of the ice mask, velocity with Descriptive Analytics and Clustering

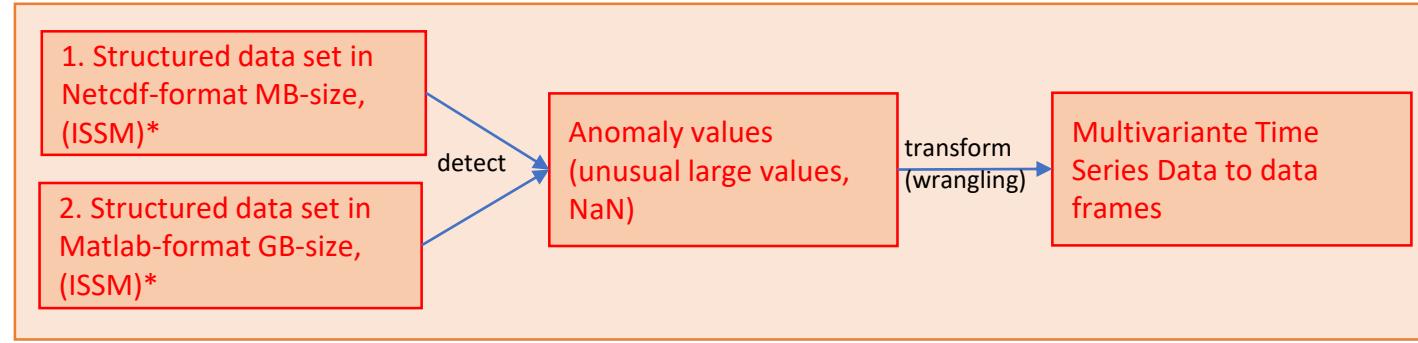
Change pattern identification in Greenland



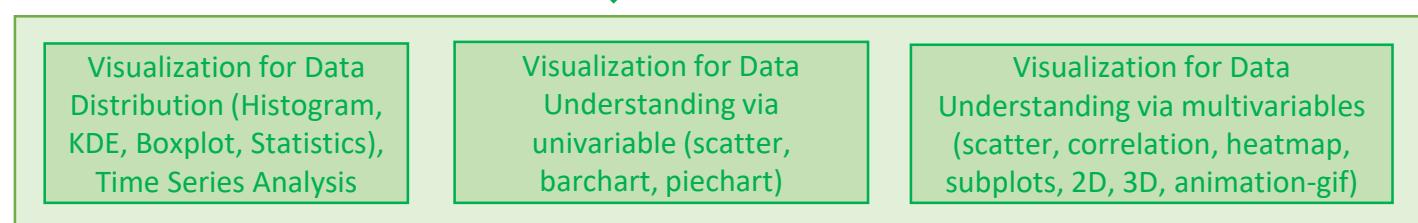
*Source: Sensitivity of Greenland ice sheet projections to spatial resolution in higher-order simulations: the Alfred Wegener Institute (AWI) contribution to ISMIP6 Greenland using the Ice-sheet and Sea-level System Model (ISSM) Rückamp et al.

Data Science Workflow in AI-CORE WP-210

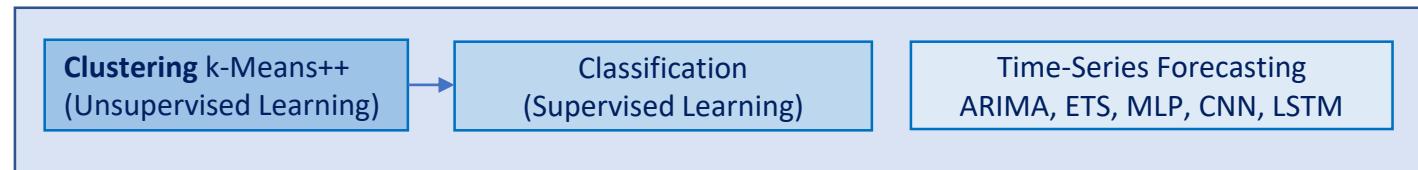
Data Preparation



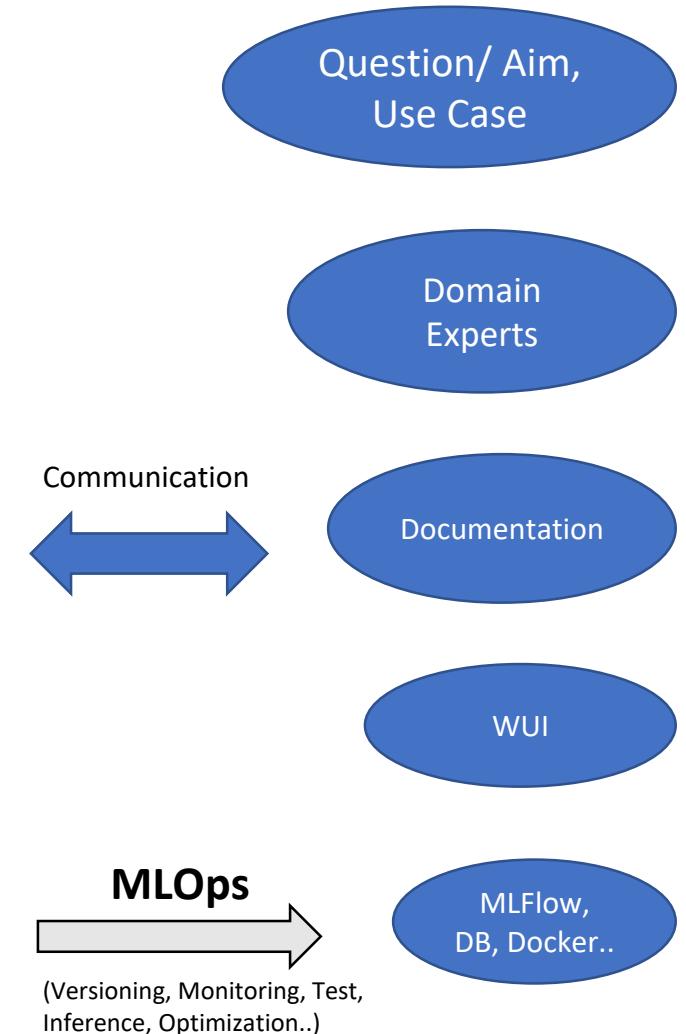
Data Exploration



Data Modeling

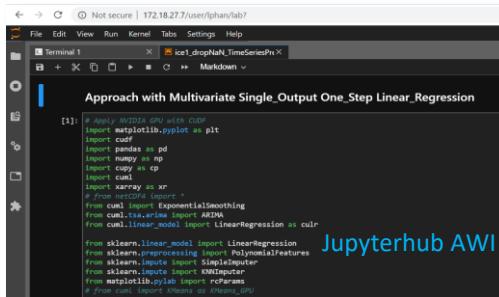


*ISSM: Ice-sheet and Sea-level System Model



Overview ML-Infrastructure

First results in 2020-2021 WP-410 Infrastructure



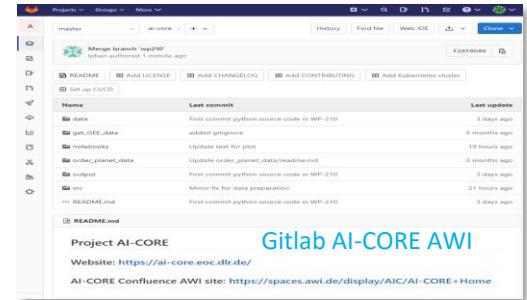
```

Approach with Multivariate Single-Output One-Step Linear Regression
[1]: # display numpy GPU via cupy
import matplotlib.pyplot as plt
import cupy
import cudf
import pandas as pd
import numpy as np
import copy as cp
import xarray as xr
# from netCDF4 import *
from xarray import expand_grid
from cuml.ensemble import ARIMA
from cuml.linear_model import LinearRegression as culr
from sklearn.linear_model import LinearRegression
from sklearn.preprocessing import PolynomialFeatures
from cuml.ensemble import RandomForestRegressor
from sklearn import KNeighborsRegressor
from matplotlib.pyplot import rcParams
# from cuml import XGBoost

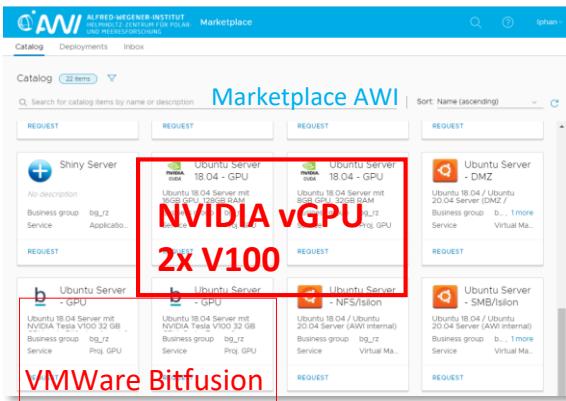
```

Jupyterhub AWI

**Next: Data Integration
HPC with GPU**

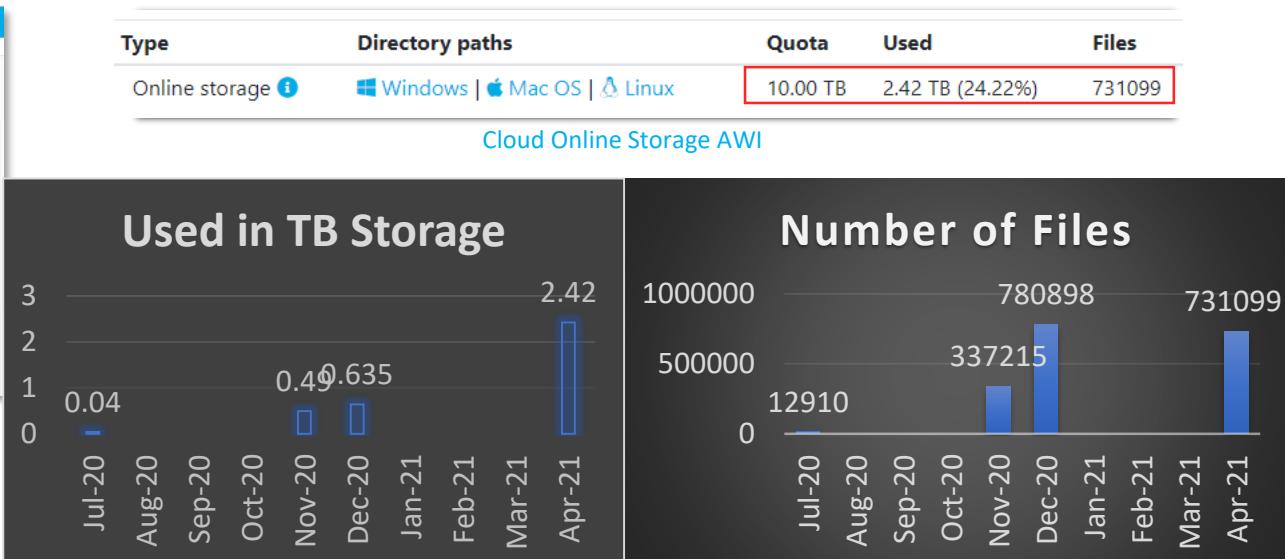
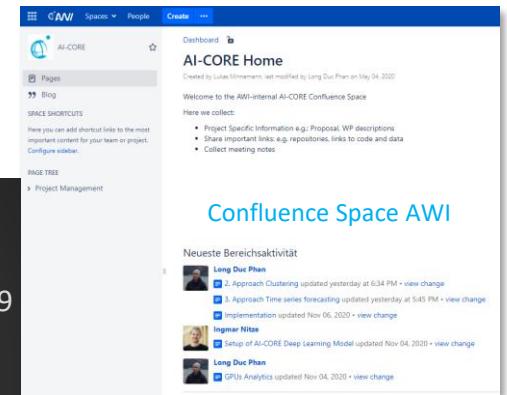


Project AI-CORE
Website: <https://ai-core.eco.dlr.de/>
AI-CORE Confluence AWI site: <https://spaces.awi.de/display/AIC/AI-CORE+Home>

NVIDIA vGPU
2x V100

VMWare Bitfusion

Confluence Space AWI

Neueste Bereichsaktivität

- Long Duc Phan
 - Approach Clustering updated yesterday at 6:34 PM + view change
 - Approach Time series forecasting updated yesterday at 5:45 PM + view change
 - Implementation updated Nov 06, 2020 + view change
 - Setup of AI-CORE Deep Learning Model updated Nov 04, 2020 + view change
 - GPU Analytics updated Nov 04, 2020 + view change
- Ingmar Nitze
 - Setup of AI-CORE Deep Learning Model updated Nov 04, 2020 + view change
- Long Duc Phan
 - GPU Analytics updated Nov 04, 2020 + view change

Software Stack – Data Science Toolkits

Overview System VM

- CPU/ GPU-compatible AI-Toolkit
- High-Level Programming: Python, Matlab, ..
- Others: Jupyter, Visualization, streamlit, MLflow..

- NVIDIA CLI Toolkit (nvidia-smi, ..)
- CUDA Toolkit (cuda-memcheck, cuda-gdb, nvprof, visual profiler, ..)
- Low-Level Programming: CUDA in C/C++
- NVIDIA Driver Enterprise & licensing vCS

- OS Ubuntu 18.04
- VMWare 7
- Setup Host environment (Network, Storage, Monitoring ..)

CPU

- Descriptive Analytics: Pandas, Numpy,
- Visualization: Matplotlib, seaborn
- Machine Learning: Scikit-Learn, Prophet
- Deep Learning: Tensorflow
- Distributed/ Parallel computing: xarray, Dask
- Data format: csv, json, netcdf, matlab

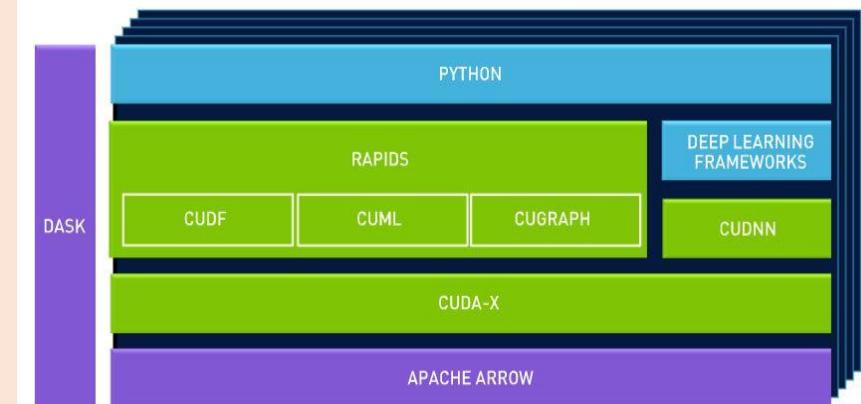
Challenges/ further Tasks

- Many frameworks/ libraries, Algorithms
- Larger data set, limited (GPU-) memory size, database
- Different requirements to Versioning, Monitoring, Auto Pipeline, expect higher performance (CPU vs GPU)
- (De)bug, code improvement, data integration
- Complex scientific use case

NVIDIA GPU

- Rapids: cuDF, cuPy,
- Rapids: cuxfilter, bokeh
- Rapids: cuML
- Tensorflow-GPU
- Dask-CUDA, CUDA in C/C++
- Apache Arrow, cuIO (int. NVIDIA)

Machine Learning to Deep Learning: All on GPU



<https://www.nvidia.com/en-us/deep-learning-ai/solutions/data-science/>

Presentation of first results via Web User Interface (WUI)

Thank you for your attention 😊

long.duc.phan@awi.de

AI-CORE Homepage: www.ai-core.eoc.dlr.de