Data Science Services – the simple way

Red Hat OpenShift Data Science introduction for the rest of us

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What we'll discuss today

- What is MLOps?
- ML Model Development
- ML Model Serving
- Offer a MLOps service to your Data Science teams
- Wrap-up and Q&A



What is MLOps?



This section includes:

What is MLOps:

- The Al Journey
- Typical roles

4

MLOps with open source



The Al Journey





5





MLOps Platform Engineering and Operations





MLOps with open source





7

8

Example for ML based condition monitoring on manufacturing production lines



High level architecture





ML Model Development



ML Model Development

11

Developer / DevOps



MLOps Platform Engineering and Operations



This section includes:

ML Model Development

- Data Scientist's Workbench
- Model Training
- ML Pipelines



Demo





Elyra pipelines

- Build, run, and share machine learning pipelines
- Built on top of JupyterLab
- Use Git to manage the versions of your pipelines

Kubeflow Pipelines

- Build, deploy, and manage end-to-end machine learning workflows
- Execution engine for Elyra pipelines
- Based on Tekton





ML Model Serving



Developer / DevOps Intelligent Applications G Data Scientist Data Serving Validation Training Deployment Collection ML Engineer

MLOps Platform Engineering and Operations



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This section includes:

ML Model Serving

- Model Serving with Red Hat OpenShift Data Science
- Utilize the model in the manufacturing example



Demo



Delivering models through GitOps





Offer a MLOps service to your Data Science teams







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This section includes:

- Offer a MLOps service to your Data Science teams
 - MLOps with Red Hat OpenShift
 - Open Data Hub
 - Cloud service and self-managed components
 - Warp-up



MLOps with Red Hat OpenShift



Open Data Hub

An open source MLOps suite



- Multi-tenant data science platform
- Self-service workspaces



- Preinstalled machine learning libraries
- Custom stack can be integrated



- Al pipeline editor
- Define workflows through Jupyter



Kubeflow Pipelines

- Machine learning
 workflow orchestration
- Experiment tracking



Kserve ModelMesh

- Deploying machine learning models as micro-services
- Pre-built inference servers



- Monitoring stack
- Native integration with OpenShift



Bringing AI/ML open source to the enterprise





Cloud service and self-managed components







Hybrid MLOps platform

Collaborate within a common platform to bring IT, data science, and app dev teams together

Now GA as fully managed cloud service and self managed on-prem



Model development

Conduct exploratory data science in JupyterLab with access to core AI / ML libraries and frameworks including TensorFlow and PyTorch using our notebook images or your own.



Model serving & monitoring

Deploy models across any cloud, fully managed, and self-managed OpenShift footprint and centrally monitor their performance.



Hardware acceleration

Accelerate your data science experiments through the use of CPU and GPU acceleration on Red Hat OpenShift.



Partner ecosystem

Optional integrated ISVs to complement core platform capabilities with access to the full partner ecosystem with over 30 AI/ML technology partners.



Thank you

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Screenshots



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This section includes:

Red Hat OpenShift Data Science - Demo Part 1



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Applications

Data Science Projects

Model Serving

Resources

Settings

Data science projects > Anwedertreffen > Create workbench

Create workbench

Configure properties for your workbench.

Jump to section

Name and description

Notebook image

Deployment size

Environment variables

Cluster storage

Anwendertreffen Description

Notebook image

Image selection *

Select one	•
Minimal Python Python v3.8	
Standard Data Science Python v3.8	

Create workbench Cancel

Name *



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Model Serving		ř.
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Create workbench

Configure properties for your workbench.

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Data Science Projects	
Model Serving	
Resources	
Settings	

Applications

Data science projects > Anwedertreffen > Create workbench

Create workbench

Configure properties for your workbench.

Jump to section

Name and description

Notebook image

Deployment size

Environment variables

Cluster storage

Cluster storage

Cluster storages will mount to /

• Create new persistent storage This creates a storage that is retained when logged out. Name * Anwendertreffen Description

Persistent storage size



○ Use existing persistent storage

This reuses a previously created persistent storage.

Create workbench

Cancel



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Applications

Data Science Projects

Model Serving Resources Settings

Jump to section Workbenches > Cluster storage Data connection Models and mod servers

Data science projects > Anwedertreffen

Anwedertreffen

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To get started, add data to your project.

Models and model servers Configure server



Add data connection	×	III 🔺 0	admin 🔻
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Add data connection Cancel			
Models and model servers Configure server			

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	README.md	seconds ago
	sensor-training-data.csv	seconds ago

MANUela Anomaly ML Model

Goal: Build a machine lerning model that detects anomalies in sensor vibration data



Vibration anomalies

Outline:

Read and preview the labeled data

- Read data from disk
- Preview the raw data
- Visualize vibration and anomalies

Data wrangling

- · Convert time series data into small episodes that can be used for supervised learning.
- Explore the new data format

Model training

Prepare the data for modeling, training and testing

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Applications

Data Science Projects

Red Hat OpenShift Data Science

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Model Serving

Resources	
Resources	

Settings

Data science projects

View your existing projects or create new projects.

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This section includes:

Red Hat OpenShift Data Science - Demo Part 2



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Data Science Projects

Model Serving Resources Settings

	Jump to section
	Workbenches
>	Cluster storage
	Data connections
	Models and model servers

Data science projects > Anwedertreffen

Anwedertreffen

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Applications

Data Science Projects

Data science projects > Anwedertreffen

Anwedertreffen

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Data Science Projects

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Resources

Settings

Data science projects > Anwedertreffen

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	Workbenches
>	Cluster storage
	Data connections
	Models and model servers

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	Body Cookies (1) Headers (6) Test Results Pretty Raw Preview Visualize JSON × =	Size: 357 B	Save Response ~
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Thank you

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TO-DO:

- Prep demo flow with Manuela Model (and recording?)
 - · Create workbench
 - Clone repo
 - Train model
 - Save mode in S3 Bucket S3



- What is in it for me?
 - OpenShift Services Owner
 - · Data Scientist / ML engineer
 - App Developer of smart applications

Notes

https://docs.google.com/presentation/d/1Tvir9Fots1QRgNsLnHfcDt32mgLF_FP9c8J5vfZeYiM/edit#slide=id.gd65fe1b395_1_251

Red Hat OpenShift Data Science_Messaging - final - New Kind

https://docs.google.com/presentation/d/1Tvir9Fots1QRgNsLnHfcDt32mgLF_FP9c8J5vfZeYjM/edit# slide=id.gd65fe1b395_1_251

CY23 RHODS Focus - AI/ML COP https://docs.google.com/presentation/d/1NXkkeLFgwOX6Ciljdb7zQMSHw91IdN98HAJpklsk45E/edit #slide=id.g1f096d90674_0_1751

OpenShift Coffee Break: MLOps with OpenShift - YouTube https://www.youtube.com/watch?v=5zHumreNS k&t=1705s

AI/ML with Red Hat for Siemens - Google Slides https://docs.google.com/presentation/d/1G3wCU2GJfsELsw7XnRwKJtGHeBFeSYyalJ5ZvRmIWwl/e dit#slide=id.g10487018f2c_0_719

Red Hat OpenShift Data Science 101 deck - Google Slides <u>https://docs.google.com/presentation/d/1YKlaYhb8Du8clmEt3wMEWZ8F2dONp3Jbetpr2r47ego/edi</u> <u>t#slide=id.g16c6c4e6195_9_0</u>

RHODS - Anwendertreffen 03-2023 - Google Slides https://docs.google.com/presentation/d/1ARDPhjqzd0_OYsLbsesg8e4WUZIBD01TIWv3hz0m4wg/e dit#slide=id.g21949895a79_0_1186



TO-DO:

- Prep demo flow with Manuela Model (and recording?)
 - · Create model server and deploy model
 - Basic test with CURL / POSTMAN
 - ["Update" Manuela to use Model



ML workflow with RHODS









ACM

Industrial use case

Red Hat OpenShift helping create the smart factory at the industrial edge

- Simplify the deployment and lifecycle management of AI-powered applications
- Accelerate data gathering, preparation, and inferencing tasks
- Consistent development platform and tools
- Turn insights into positive business outcomes faster

53 Legend:

ML Train: Machine learning training ML Infer: Machine learning inference MES: Manufacturing execution system ACM: Red Hat Advanced Cluster Management for Kubernetes PLC: Programmable logic controller PLM: Product lifecycle management



Al at the Factory





Others running AI on Red Hat OpenShift





AI/ML consulting services portfolio

A modular approach to customer implementations



Open AI/ML platform	
☐ 4-8 weeks	
MLOps Foundation	
□ 6-12 weeks	
Intelligent application developme	nt pilot
□ 6-12 weeks	
Data engineering pilot	
$\square 6_{-12}$ wooks	

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youtube.com/user/RedHatVideos

MLOps with Red Hat

An Overview

Max Dargatz Senior Solution Architect mdargatz@redhat.com Max Murakami Specialist Solution Architect mmurakam@redhat.com

MLOps with Red Hat

MLOps Platform

Demo: ML CI/CD Pipeline

Q&A

The AI Journey

60

What is <u>MicroShift</u>?

A small form-factor OpenShift for field-deployed devices

OpenShift

MicroShift

End to End - AI / ML workflow

MLOps with Red Hat OpenShift

MLOps Platform Vision

Project Workspace	Data Science IDEs	Data Science IDE Plugins	Admin Console				
Service APIs							
	MLOps Integration Framework						
Data ProcessingModel TrainingExperiment TrackingHyper-parameter TuningML WorkflowsModel ServingModel CatalogModel Governance							
Red Hat OpenShift							
Physical	Virtual	Cloud Public Cloud	Edge				

https://red.ht/rhods-sandbox

Bringing AI/ML open source to the enterprise

Open Data Hub

An open source AI/ML suite

- Popular data science platform
- Self-service Jupyter notebooks

- Al pipeline editor
- Define workflows through Jupyter

- Cloud-native pipeline orchestration
- Serverless execution

- Deploying machine learning models as micro-services
- Full model lifecycle management

- Distributed object store
- S3 Interface

- o kafka
- Distributed event streaming
- Pub/sub messaging

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- Distributed SQL engine
- Integrate heterogeneous data sources

- Data management
- Data lineage & versioning

Uninstall	a ta Hub Operator y Open Data Hub	×		
Latest version 12.0 Capability level Pasic Install Seamless Upgrades Full Lifecycle Deep Insights Auto Pilot Source Community Provider Open Data Hub Repository https://github.com /opendatahub- io/opendatahub-	Installed Operator This Operator has been installed on the cluster. View it here. The Open Data Hub is a machine-learning-as-a-service platform bui OpenShift® Container Platform. Open Data Hub integrates multiple one operator that can easily be downloaded and installed by OpenSH Open Data Hub operator allows users to install and manage Open D Users can mix and match tools from each project to fulfill the needs share some components, but can be mostly seen as an extension of solution for both novice and skilled enterprise users. Components • JupyterHub v0.3.6 - Open source multi-user JupyterLab notebon High Availability. • Trino v355 - Distributed analytics SOL database that supports m • Hue v4.8.0 - A service that allows JDBC clients run Spar • Open Data Hub Dashboard v1.0 - A web dashboard that displays	It on Red Hat's Kubernetes-based AI/ML open source components into hift users. Welcome to Open Data Hub. Open Data Hub is an open source projec Learning (ML) workflows, Jupyter Notel Open Data Hub includes several open source Show All	ct based on Kubeflow that provides open book development environment and moni ource components, which can be individial	source AI tools for running large and distri itoring. Ily enabled. Several have their own UIs wh
operator & Container image quay.io/opendatahub/ope ndatahub-operator:v1.2.0 Created at ③ Jan 31, 2021, 1:00 AM Support Open Data Hub	with easy access to component UIs and documentation Elyra v3.6.0 - NEW JupyterLab notebook with support for AI wor Ceph Nano v0.7 - Minimal Object Storage provided by Ceph for of Prometheus - Monitoring and alerting tool Grafana - Data visualization and monitoring Airflow v1.10.11 - Workflow management Seldon - Open source platform for deploying machine learning m Argo v2.12.5 - Container-native Workflow Engine Apache Superset v1.4.1 - NEW Open source application for data e Apache Kafka - The open source stream processing platform OpenShift Pipelines - Cloud-native CI/CD on OpenShift To install one or multiple of these components use the default KfDet	↓ JupyterHub A multi-user version of the notebook designed for companies, classrooms and research labs	F Argo Kubernetes native workflows, events, CI and CD I Launch I Launch	★ Laurch
	NOTE: Components without versions are defaulting to the default re OperatorHub. These versions may change as each component upda in OperatorHub.	Kafka Distributed event streaming platform	Airflow Platform to programmatically author, schedule, and monitor workflows	Hue Data exploration platform for Hive and S3 storage

ibuted Al workloads on OpenShift Container Platform. Currently, the Open Data Hub project provides open source tools for data storage, distributed Al and Machine nich you can launch from this page. Click on an Open Data Hub component application to launch the UI or take you to the documentation to find out more. 0 S 6 : : Spark : : Grafana Spark Seldon Prometheus Systems monitoring and alerting Visualization and analytics Unified analytics engine for Platform for rapidly deploying toolkit software large-scale data processing machine learning models on Kubernetes. C Launch 🗹 Launch Spark : Spark SQL Thrift Server Expose Spark data frames modeled as Hive tables through a JDBC connection Not Installed

Strategic partnerships within AI/ML ecosystem

