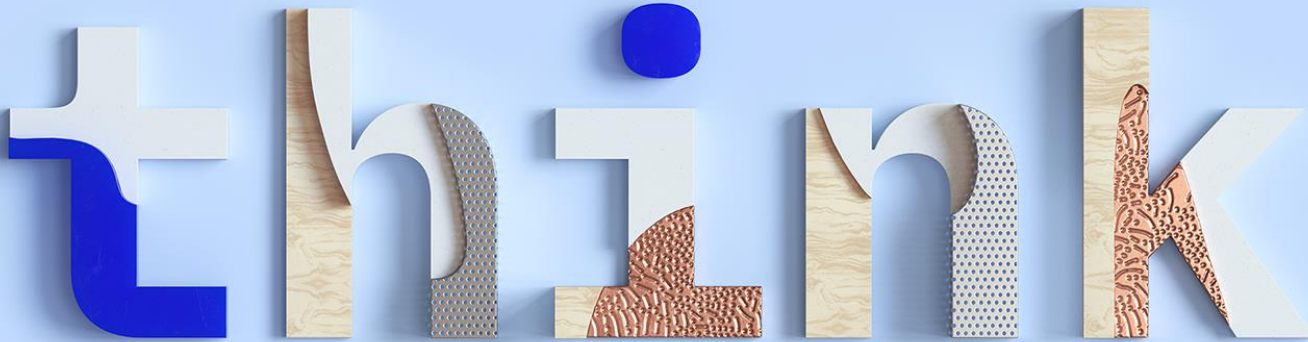


Bring Intelligence to Where Critical Transactions Run: IBM Machine Learning Technical Deep Dive

think 2018

Session 2702



Kewei Wei,
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IBM Machine Learning Lead Architect

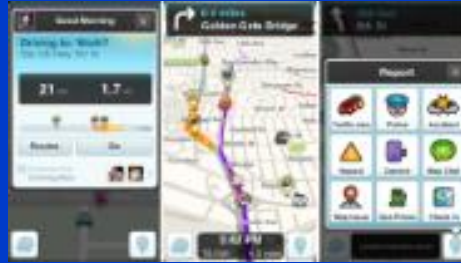
Maggie Lin,
meichi@us.ibm.com
IBM Machine Learning Development Lead

Machine learning is everywhere,
influencing nearly everything we do...

Learn without being explicitly
programmed

- Identifies patterns in historical data
- Builds behavioral models from patterns
- Makes recommendations

**Waze personalized
driving experience**



**Netflix personalized
movie
recommendations**



**7 out of 10 financial customers would take
recommendations from a robo advisor**



Agile Organizations

Convert insight into opportunity

- Personalizing every interaction
- Detecting fraud before a transaction completes
- Extending demographic reach
- Improving employee productivity
- Disrupting the competition and the disrupters

Look for innovative ways to improve insights & reduce costs

- Real-time actions are a game changer
- Transactional data is critical to real-time predictive insight
- Minimizing data movement drives cost efficiency, improves governance and security and reduces decision latency risk



IBM MACHINE LEARNING

Platform agnostic functionality with the same look and feel across deployment options



Integrates the most popular open source tools such as Spark, Python, R, Jupyter & Scala.

Machine Learning on IBM Cloud

PayGo consumption with as-a-service delivery, up & running in seconds

Integrated with IBM Spark-as-a-Service for compute, IBM Object Store for data, as well as other platform assets

Immediate cloud collaboration via RStudio and Jupyter notebooks

Machine Learning in IBM DSX

Scalable DSX cluster deployed on your private infrastructure

Can be deployed with Hortonworks Data Platform on-premises

LDAP integration for user management

Meaningful collaboration via notebooks, IDEs, community, and social features

Machine Learning for z/OS

On-premises, IBM Z, scalable Spark cluster deployment on private cloud

Cost effective strategy for lowest latency and highest degrees of resiliency and security

DSX is built into the ML for z/OS infrastructure

Close Integration with Z

Machine Learning for z/OS Brings Advanced Analytics and Compute to Your Data

IBM Z Point of View:

- Move compute to the data (Data Gravity)
- Industry leading encryption and security
- Resiliency on par with transactional apps
- Combine insight from any platform
- Leverage existing people, processes and infrastructure

Enabling:

- Personalize every interaction
- Convert insight into opportunity and opportunity into revenue
- Automatically identify and minimize risk
- Disrupt the competition and the disrupters
- Drive down costs

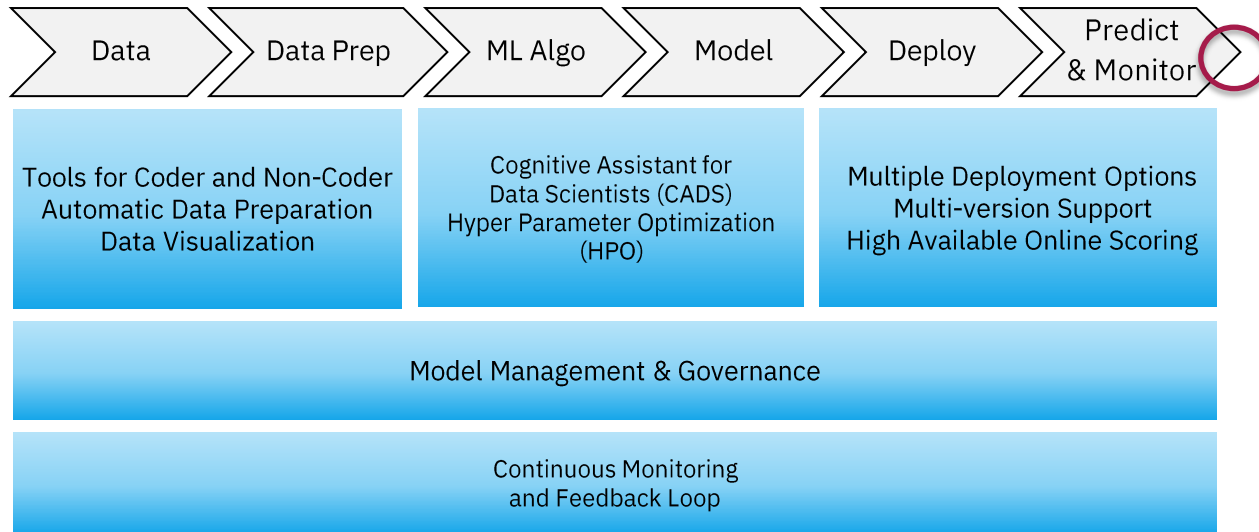


Machine Learning for z/OS Provides Full Lifecycle Management for Faster ROI

Provides an end-to-end framework for ML in an enterprise environment

Leverage open source frameworks algorithms for ease of integration and accessibility of skills

Drastically simplifies workflow and assists with each step of the process from UI, data prep, model selection, parameter selection, deployment and most importantly monitoring for continuous feedback



Data Gravity

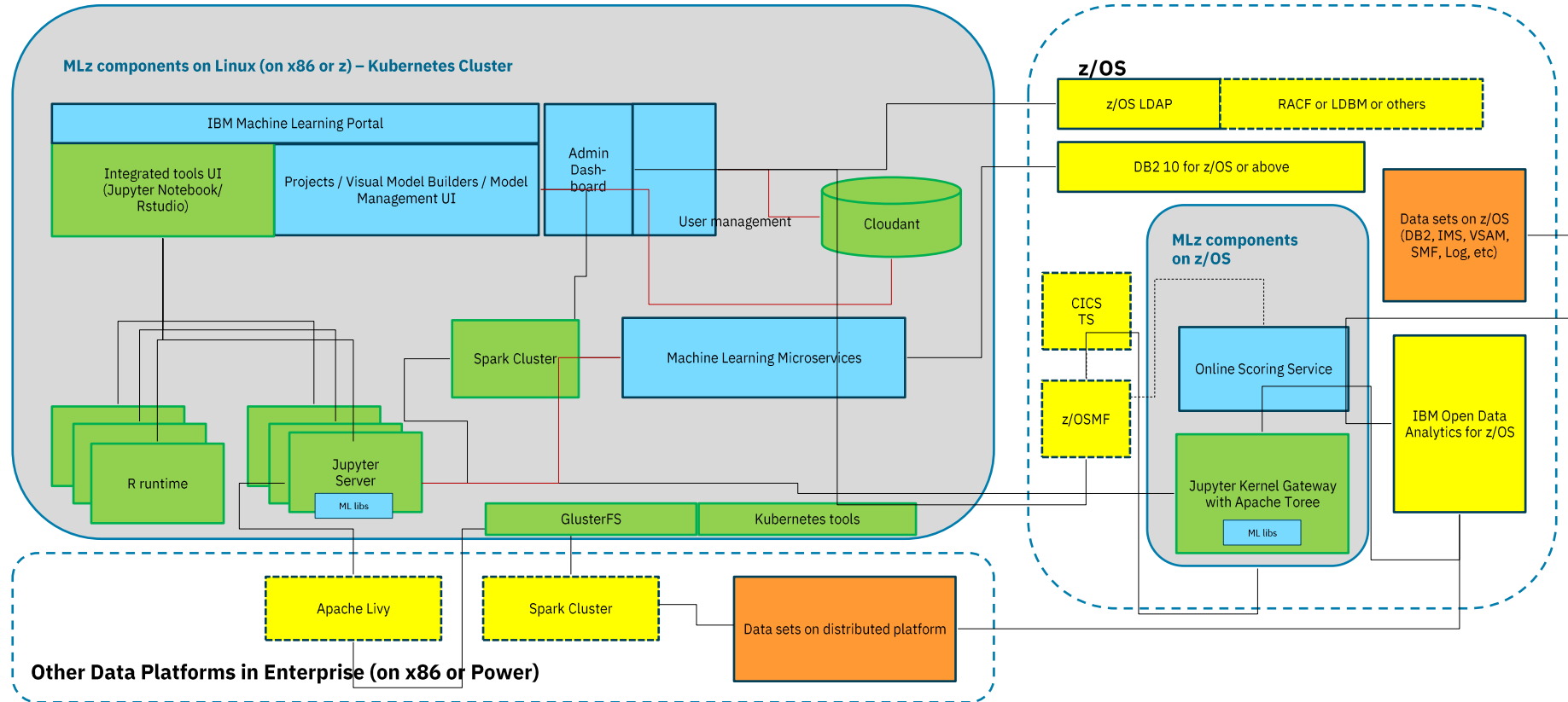


Leverage current data for improved insights

Data-in-place for efficiency and more frequent model refresh

Optimized deployment at point of transaction

IBM Machine Learning for z/OS Architecture



IBM Machine Learning Roadmap in 2018

Integration

Moving compute to data - **Db2 Analytics Accelerator**

Best combination of rule-based decision with Machine Learning - **Optimization Decision Manager**

Compliance

Audit-able machine learning

- Audit traces for entire model life cycle
- Policy based trace for scoring request

Freedom

More choices for machine learning on z/OS

- Natural language processing packages
- Machine Learning libraries for R and xgboost

Simplification

Simplifying installation and upgrade for z/OS components of IBM Machine Learning

For Data Scientists

ML accelerators from IBM research

Cognitive Assists for Data Scientist (CADS) tools help select the optimal algorithm and parameters

Auto-Data Preparation tool helps transform data automatically

Data exploitation in-place

Data scientists can exploit Z data securely through Open Data Analytics for z/OS

MLz provides options to use any machine learning runtime close to data, structured and/or non-structured

Collaboration & Isolation

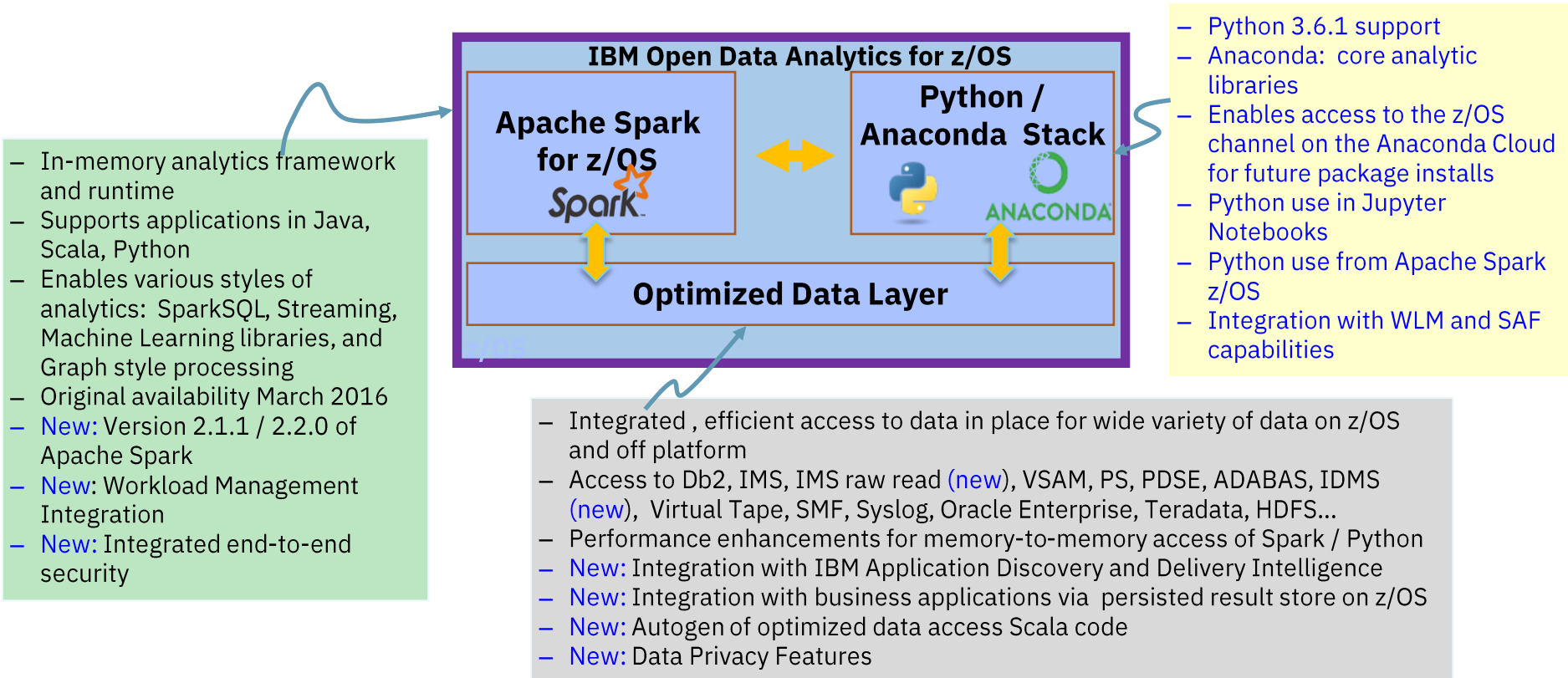
Multiple data scientists with different roles collaborate in one project

Project workspace is isolated and can have its dedicated resources and packages

Choices for all data scientists

MLz integrates tools for all types of data scientists – regardless of whether they are coders or non-coders, which programming language they learn, which ML libraries they prefer

IBM Open Data Analytics for z/OS: three major components



Training Models with Data In-place



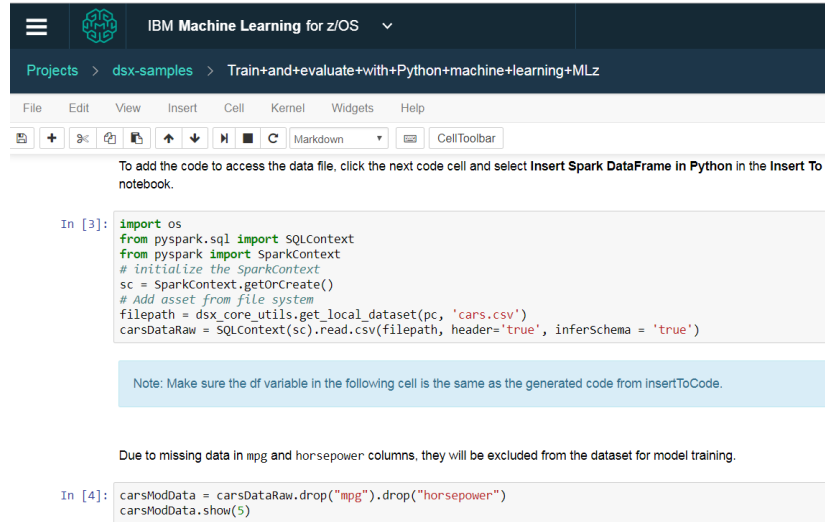
Philosophy for model creation and deployment

- **Train models at where data resides, deploy models at where transactions run**

Machine Learning for z/OS supports

- **Train models on IBM Z**
 - With **IBM Open Data Analytics for z/OS (IzODA)**
 - If the majority of the training data is from z/OS
 - If the training data on z/OS cannot be offloaded for security or latency reason
- **Train models off IBM Z**
 - With **build-in Spark cluster**
 - If the majority of the training data is outside of z/OS, and
 - the training data set is not large <1G
 - Can add spark work resource through “**add compute node**” feature
 - With **external Spark cluster**
 - If the majority of the training data is outside of z/OS

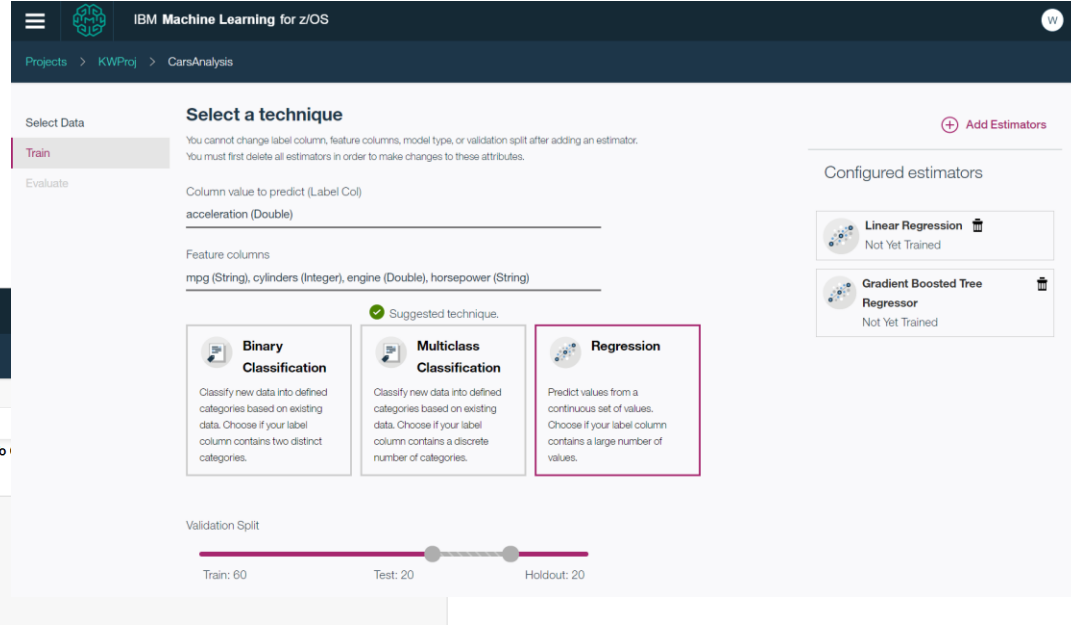
Model development tools for both coder and non-coder



```
In [3]: import os
from pyspark.sql import SQLContext
from pyspark import SparkContext
# initialize the SparkContext
sc = SparkContext.getOrCreate()
# Add asset from file system
filepath = dsx_core_utils.get_local_dataset(pc, 'cars.csv')
carsDataRaw = SQLContext(sc).read.csv(filepath, header='true', inferSchema = 'true')
```

Note: Make sure the df variable in the following cell is the same as the generated code from insertToCode.

```
In [4]: carsModData = carsDataRaw.drop("mpg").drop("horsepower")
carsModData.show(5)
```



IBM Machine Learning for z/OS

Projects > KWProj > CarsAnalysis

Select Data

Train

Evaluate

Select a technique

You cannot change label column, feature columns, model type, or validation split after adding an estimator. You must first delete all estimators in order to make changes to these attributes.

Column value to predict (Label Col)

acceleration (Double)

Feature columns

mpg (String), cylinders (Integer), engine (Double), horsepower (String)

Suggested technique.

Binary Classification

Classify new data into defined categories based on existing data. Choose if your label column contains two distinct categories.

Multiclass Classification

Classify new data into defined categories based on existing data. Choose if your label column contains a discrete number of categories.

Regression

Predict values from a continuous set of values. Choose if your label column contains a large number of values.

Configured estimators

Linear Regression

Not Yet Trained

Gradient Boosted Tree Regressor

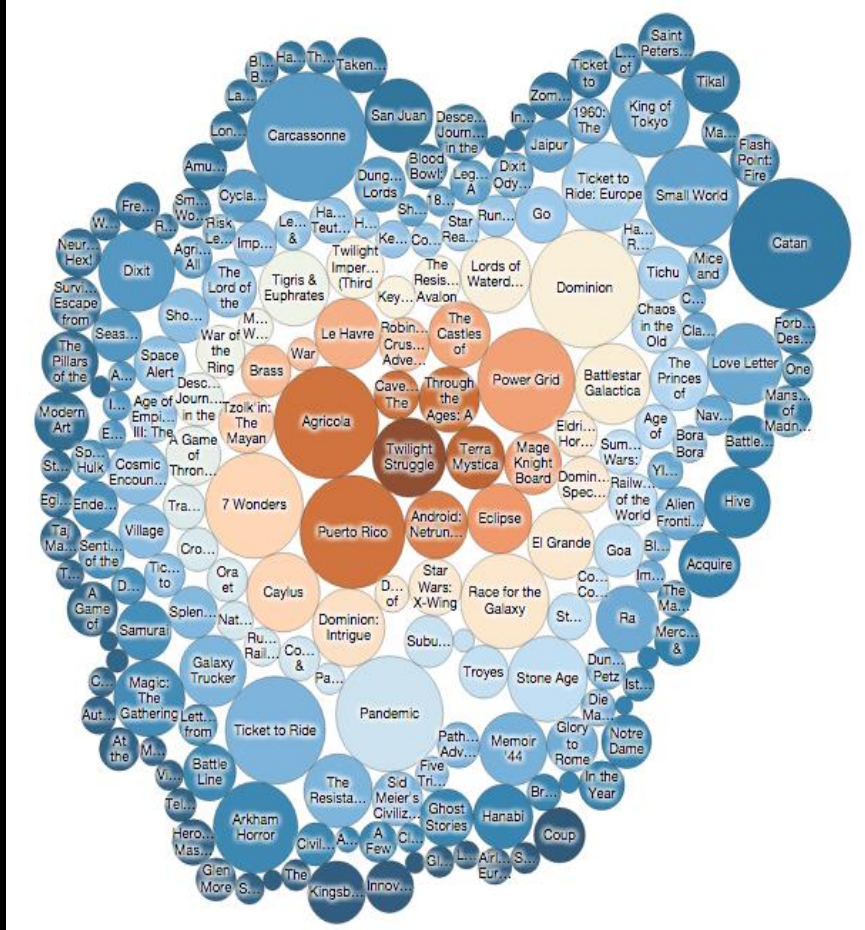
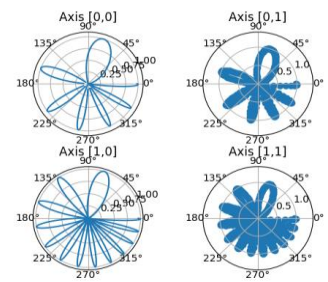
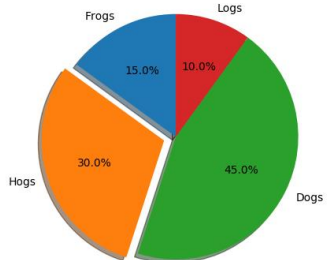
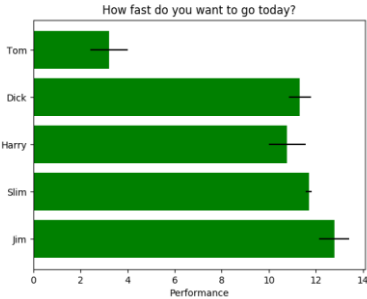
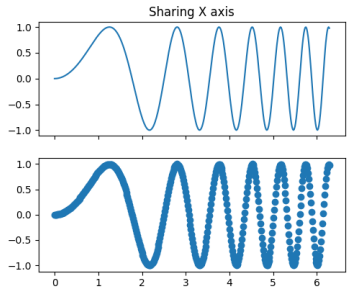
Not Yet Trained

Add Estimators

Validation Split

Train: 60 Test: 20 Holdout: 20

Built-in Visualization Libraries

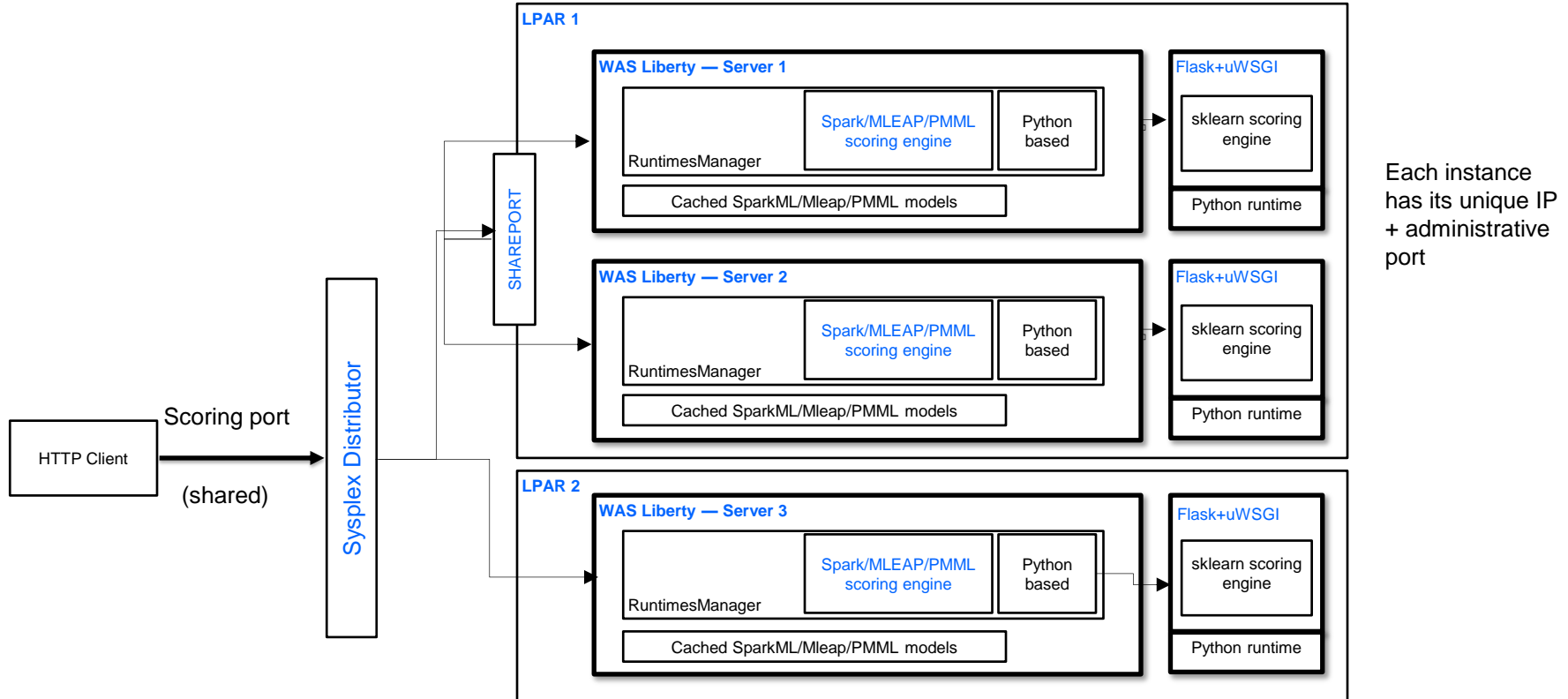


Manage Scoring Service through MLz UI

Scoring service configuration

- Define the scoring service through MLz UI administration dashboard
 - Continue to support HTTP and HTTPS access to the scoring server
 - Users continue need to configure the scoring server config file (e.g. scoring.cfg) and start/stop scoring server at the backend z/OS system
- A new capability in MLz v 1.1.0.5 (Feb/2018 release), user can manage scoring service completely through MLz UI
 - With this capability, the scoring server can be created/configured/started/stopped/removed directly through MLz UI Admin Dashboard
 - Support for SPARK/MLeap/Python scoring server.

High Available Online Scoring Service Cluster

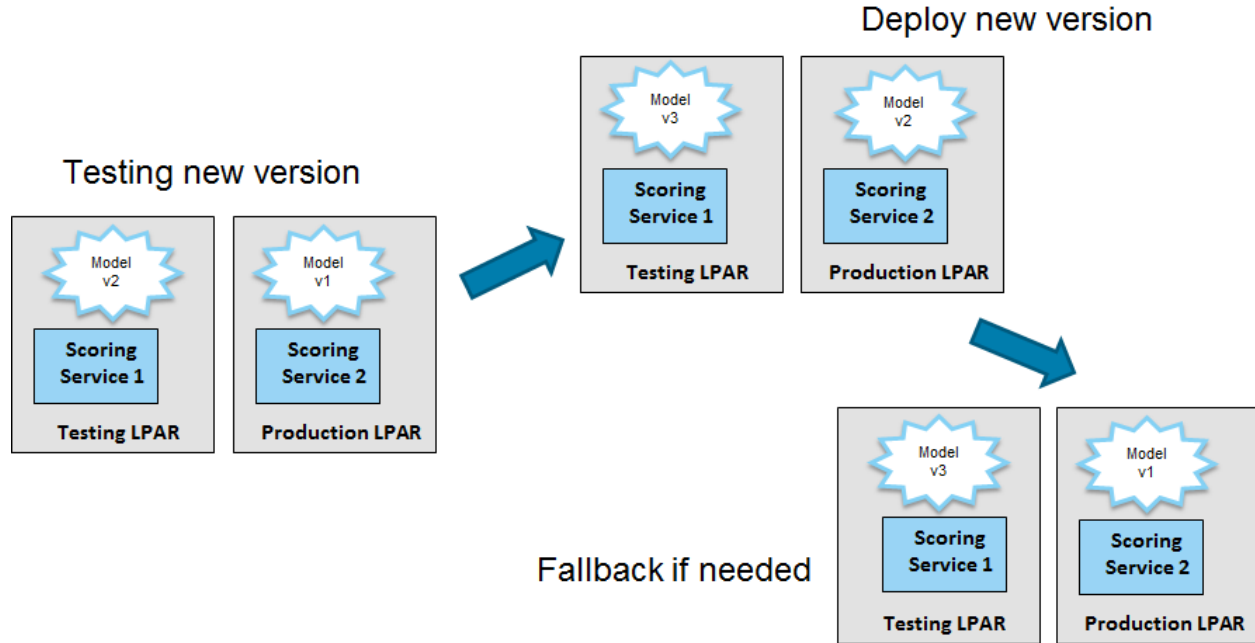


Versioning support for Models and Model Deployment

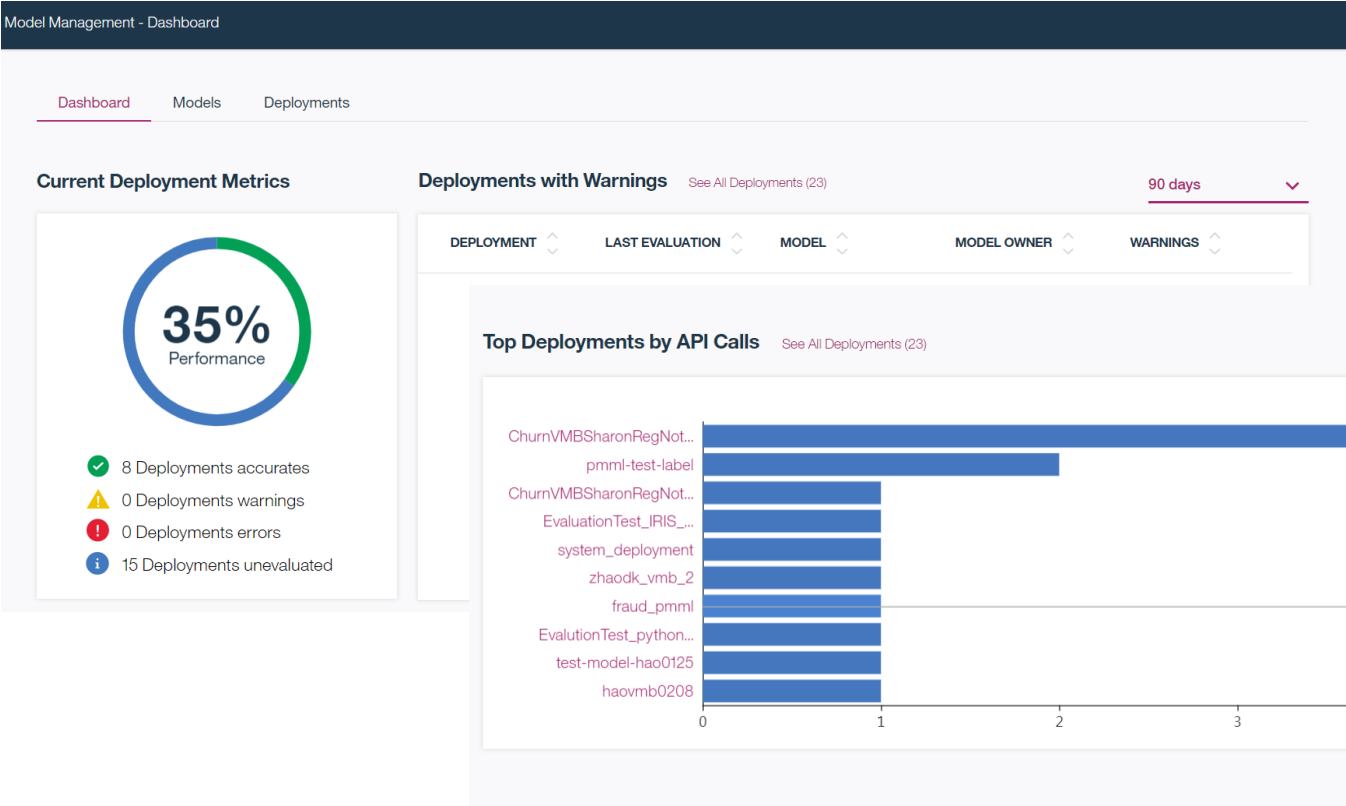
A model can have multiple versions

Different versions of the same model can be deployed to different online scoring services

Model version upgrade is transparent to applications



Model Management for Machine Learning Administrator



A single view to manage models and deployments

Deployment details for the model

API support for Application Developer

The screenshot displays the IBM Machine Learning for z/OS interface. The top navigation bar includes the IBM logo, the text 'IBM Machine Learning for z/OS', and a user profile icon. Below the navigation bar, the breadcrumb 'Deployments > churn_deploy - Overview' is visible. The main content area is titled 'DEPLOYMENT NAME churn_deploy' and includes a 'Test API' button. Key deployment details are listed in a grid:

- SCORING ENDPOINT:** `http://9.30.128.43:13350/impl/v2/scoring/online/1064`
- ONLINE FEEDBACK ENDPOINT:** `http://9.30.117.21:14350/v2/feedback/1064`
- API SPECIFICATION:** API specification for scoring endpoint is available. [Download](#)
- PUBLISHER:** mlin
- TYPE:** Online
- SCORING SERVICE:** mlz_sd_cluster (9.30.128.43:13350)
- DATE DEPLOYED:** Feb 27, 2018 7:01 AM
- ENGINE:** MLeap
- NUMBER OF INVOCATIONS:** 2
- ASSOCIATED MODEL NAME:** churnMaggie_testGA6 v1
- NEXT EVALUATION DATE:** —
- AVERAGE ELAPSED TIME:** 681.00 ms

Below the details, a 'REQUEST HEADER' section links to [See the API documentation for more details](#). A 'Model Schema' section is also present, with tabs for 'Table', 'JSON', and 'JSON Schema'. The 'Table' tab is selected, showing two schemas:

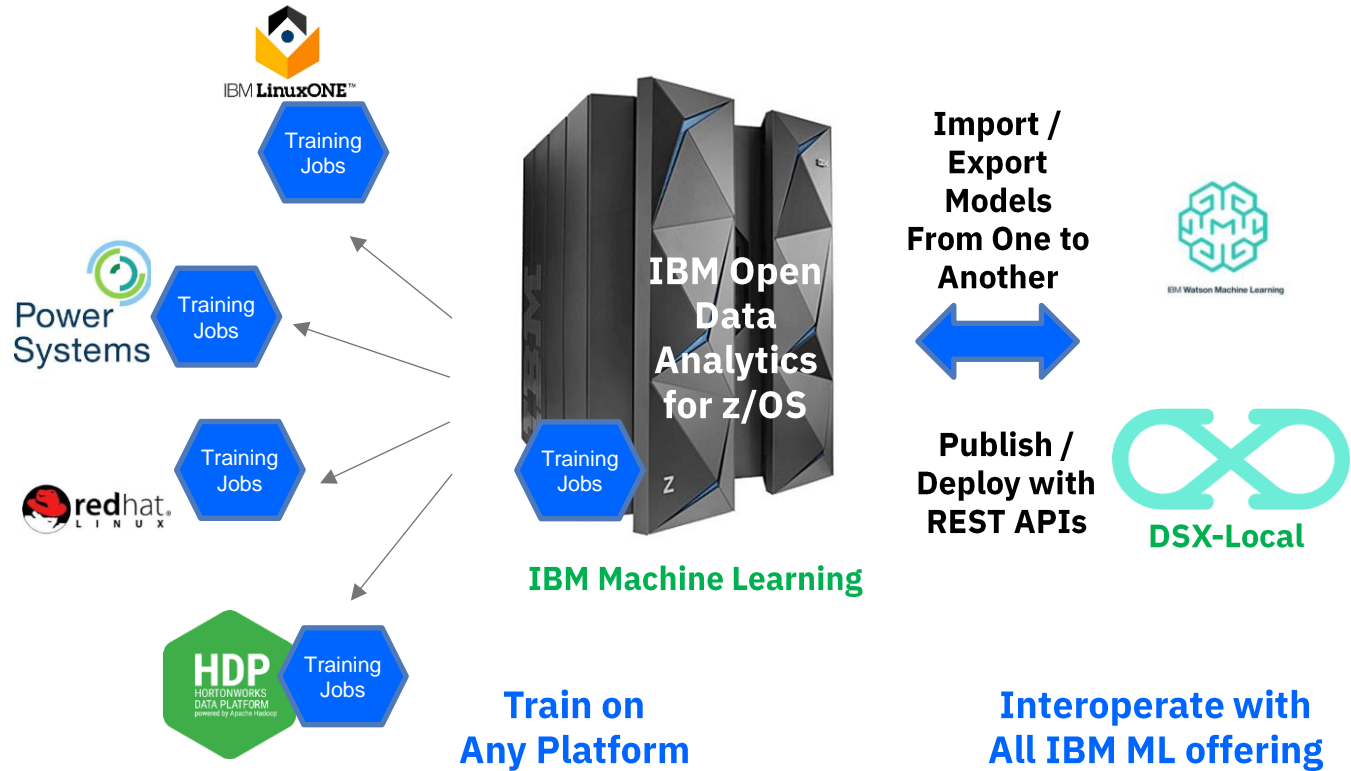
| Input Schema | | | | Output Schema | | | |
|--------------|--------|----------|----------|---------------|--------|----------|----------|
| NAME | TYPE | NULLABLE | METADATA | NAME | TYPE | NULLABLE | METADATA |
| ACTIVITY | double | false | empty | prediction | double | false | empty |
| AGE | double | false | empty | | | | |
| EDUCATION | double | false | empty | | | | |
| INCOME | double | false | empty | | | | |
| NEGTWEETS | double | false | empty | | | | |

Flexible Deployment Options

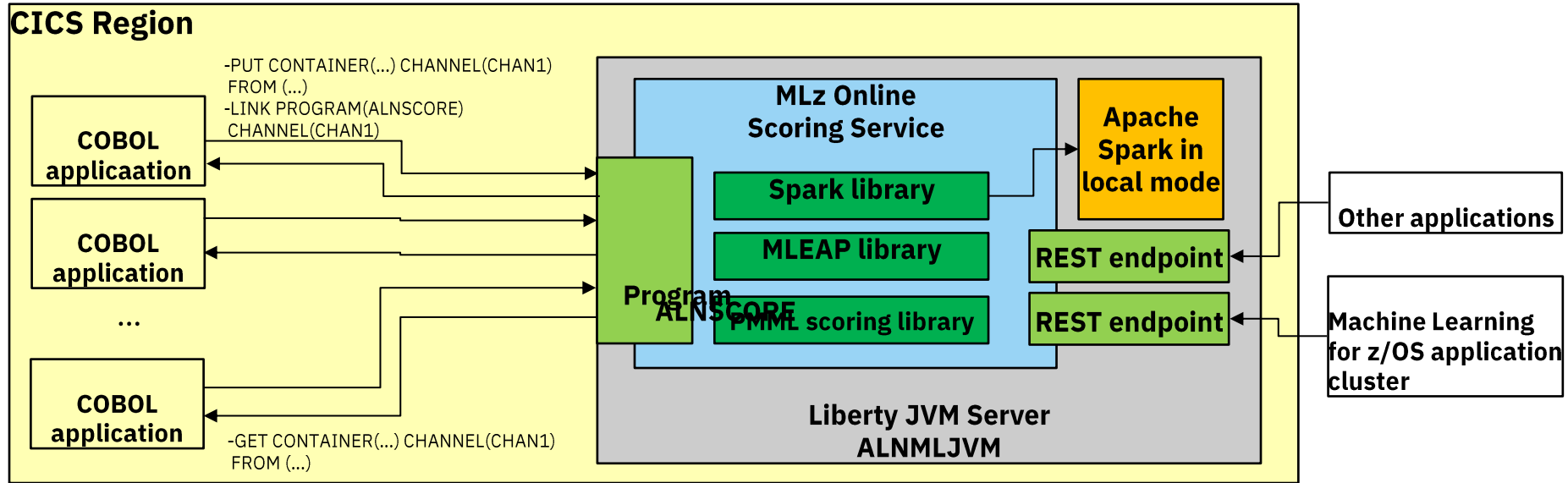
Train models on any platform, deploy on any platform

Train models in any IBM ML offerings (MLz, WML, DSX-Local), deploy on another

- Import / export
- Unified APIs



CICS-integrated Online Scoring Service

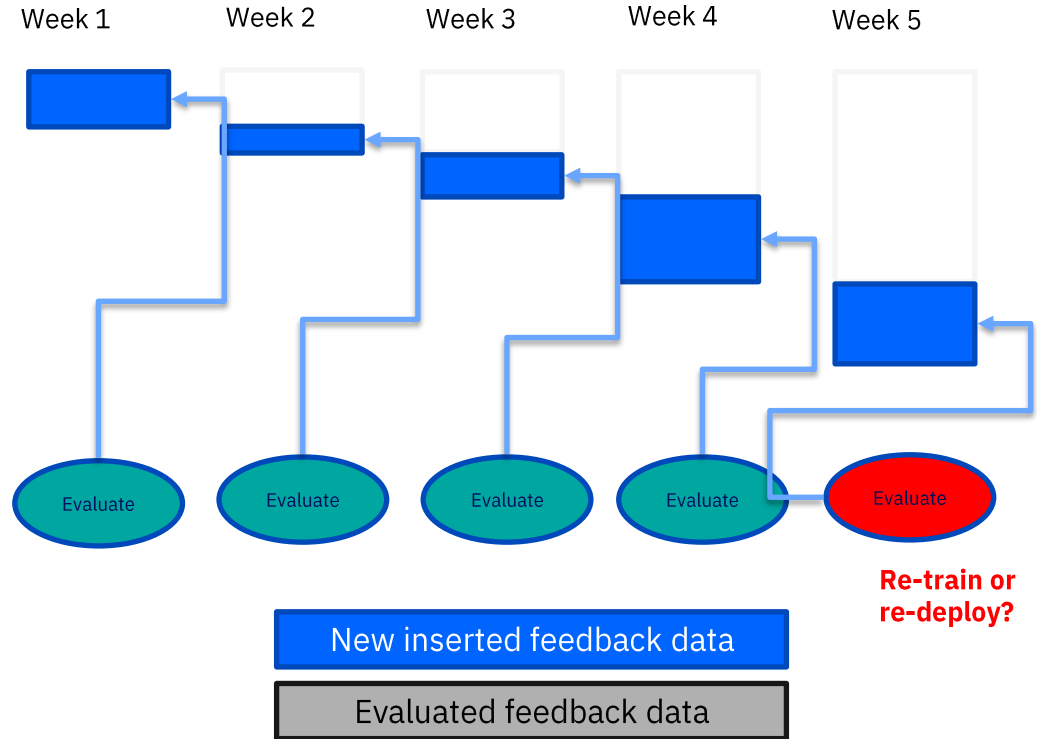


Continuous Learning System

Feedback data is ingested to feedback dataset

An evaluation task monitors performance of a model with pre-defined threshold

Model is automatically re-trained (and optional re-deployed) to improve its own performance





Schedule Evaluation

Performance Metrics

Evaluator

MulticlassClassifierEvaluator

☐ Use performance metrics to monitor this model

weightedPrecision

☐ Notify when less than

weightedRecall

☐ Notify when less than

weightedFMeasure

☐ Notify when less than

SCHEDULE

Starts at *

Mar 14, 2018 6:51 AM

Repeat *

Never

Ends on

(Optional)

DATA SOURCE

Data source type *



Dashboard

Models

Deployments

Current Deployment Metrics



- ✓ 0 Deployments accurates
- ⚠ 3 Deployments warnings
- ! 0 Deployments errors
- i 4 Deployments unevaluated

Deployments with Warnings

[See All Deployments \(7\)](#)

1 week



| DEPLOYMENT | LAST EVALUATION | MODEL | MODEL OWNER | WARNINGS |
|----------------------------------|-----------------------|---------------------|-------------|----------|
| LB-churnModel-v2- Deployme... | Mar 11, 2018 10:37 PM | LB-churnModel | Imbui | 1 |
| churnMaggie_testGA 6_qinll... | Mar 10, 2018 6:15 PM | churnMaggie_testGA6 | mlin | 2 |
| churn_deploy | Mar 7, 2018 7:31 PM | churnMaggie_testGA6 | mlin | 1 |

Some highlights from the content

- Value proposition of Machine Learning for z/OS
- Open Data Analytics for z/OS
- Installation and customization
- Upgrade and migration
- Administration and operation
- Model development and deployment
- Use cases for using Machine Learning for z/OS
 - Anti-fraud
 - ITOA
 - Banking churn
 - Investment advisory
 - Loan approval

Turning Data into Insight with IBM Machine Learning for z/OS



Thank You