



Smarter IBM i Applications Made Easy with AI

Benoit MAROLLEAU – Cloud & AI Architect
IBM Garage for Systems / Red Hat CoC, Montpellier, France
benoit.marolleau@fr.ibm.com



Agenda

Introduction to AI & Machine Learning

Solutions on IBM i

Free Open Source, AutoML, API's, POWER9 and POWER10

How to get started?

Online Demos, code & materials



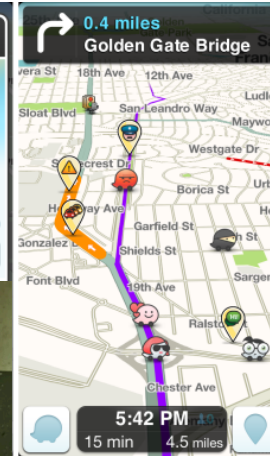


AI & Machine Learning ?



Machine learning is everywhere –
influencing nearly everything we do

Netflix provides personalized
movie recommendations



Waze provides a personalized
driving experience for its users

The future is now ... on IBM i

Images



Transactional

Transactional Data: Store Level

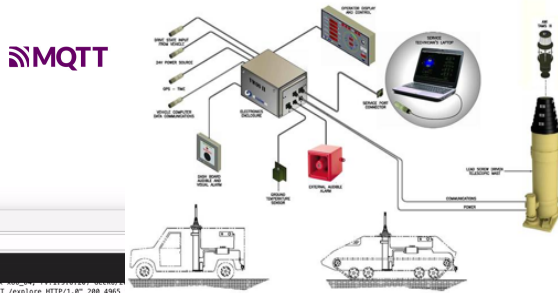
Product	Count	Amount
PROD001	10	1.00
PROD002	10	1.00
PROD003	10	1.00
PROD004	10	1.00
PROD005	10	1.00
PROD006	10	1.00
PROD007	10	1.00
PROD008	10	1.00
PROD009	10	1.00
PROD010	10	1.00
TOTAL	100	10.00

Transaction ID	Date	Time	AMOUNT	Card_number
q3213055167	11/24/2010	3:20:32 AM	14.47525	*****2323
q6781991970	12/4/2010	10:30:10 AM	39.46618	*****6451
q9178278202	11/2/2010	1:23:21 AM	24.99964	*****2179
q7529082178	10/9/2010	12:29:40 AM	19.21324	*****5626
q6835491952	10/17/2010	10:36:12 PM	39.54086	*****9408
q8333871154	12/5/2010	5:22:59 PM	33.35401	*****9379
q1240335519	10/27/2010	4:12:38 AM	49.64481	*****4466
q54401236113	11/26/2010	10:36:36 PM	24.23247	*****1816
q8906115216	11/3/2010	1:57:33 PM	32.45101	*****2662
q1400944560	11/25/2010	7:26:45 PM	32.12293	*****4130
q364500089	10/9/2010	11:09:58 AM	21.93351	*****6533
q6738256686	11/23/2010	10:34:36 AM	21.71996	*****4615
q8964299443	11/24/2010	1:19:24 AM	15.46741	*****7694
q9012945206	11/22/2010	2:02:15 PM	31.14203	*****7140
q2116305113	11/23/2010	7:15:13 PM	43.16047	*****9308
q7478724264	12/2/2010	12:08:46 PM	40.14018	*****2695
q9844400319	10/11/2010	3:10:19 AM	23.70907	*****2980
q1240335519	11/2/2010	10:19:18 AM	32.73302	*****6777
q5672364584	10/30/2010	11:54:37 PM	25.11828	*****9934

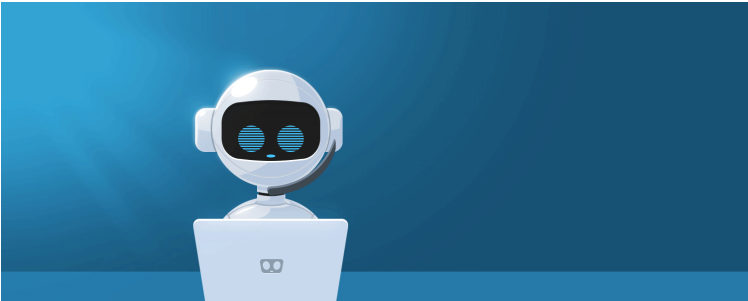
Machine Learning
and AI are everywhere

Example: Flat File

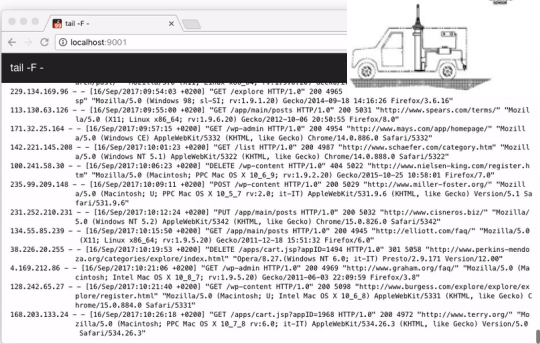
Sensors



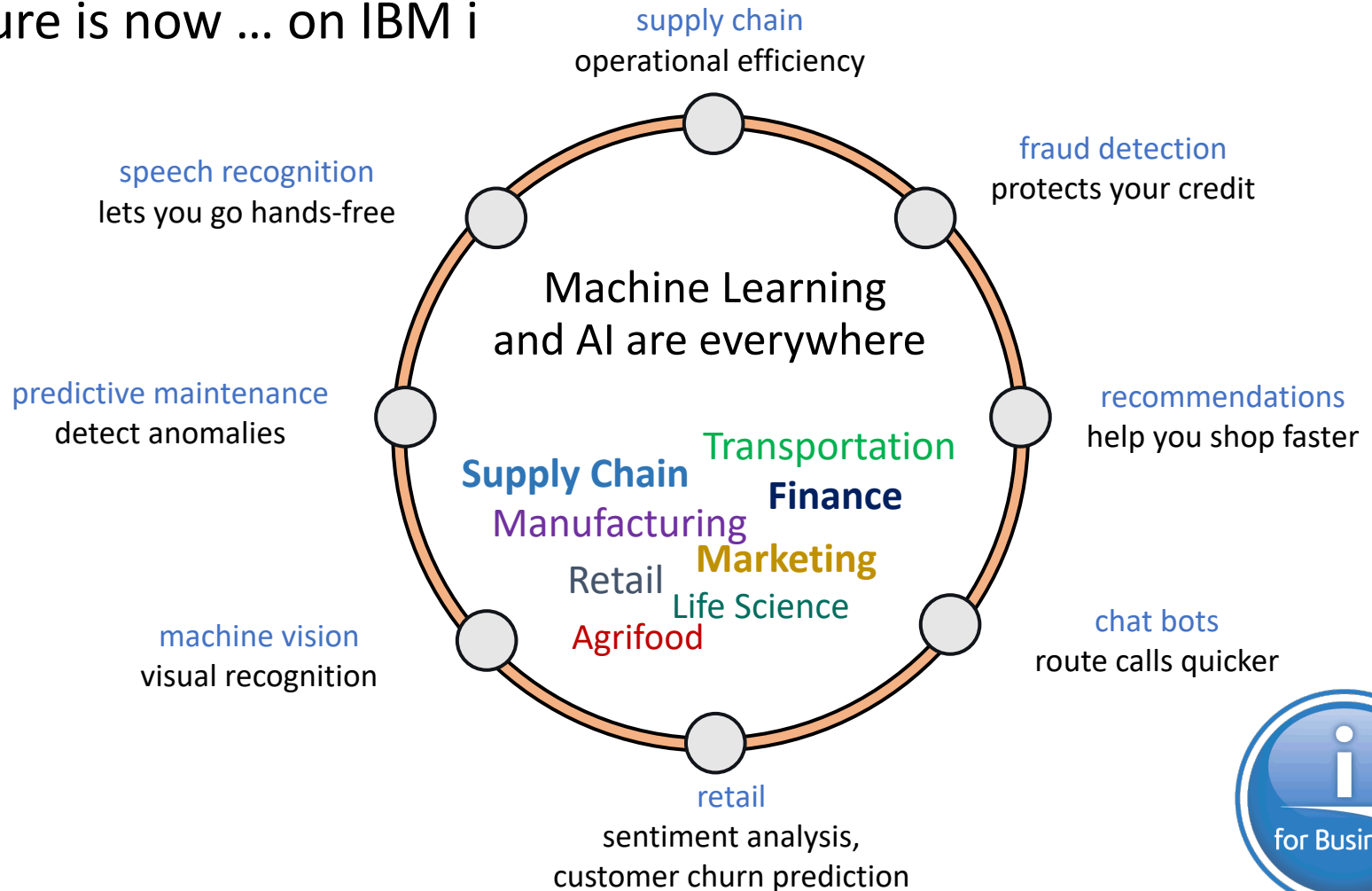
Conversation



Log



The future is now ... on IBM i



Why augmenting my apps with AI ?

Decision Optimization

Event / Pattern detection (images, structured data), Classification, customer segmentation. Decision Optimization: do more with less, make better decisions, better address my customers , etc. From a simple (but smart) dashboard to complex fraud detection



Augmentation/ Automation

- Repetitive tasks and time-consuming analysis based on images, cases with constrained access... Ex: A doctor could spend hundreds of hours per week to read new studies & publications
- Enhance user experience by exposing new user interfaces - image, voice, text, Ex: Chabot (Natural Language Processing)



AI is necessary when dealing with complex situations, where rules can't easily be coded with if-then-else.

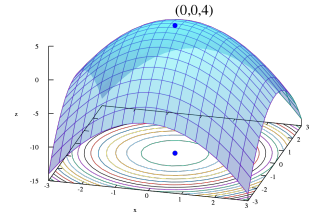
Why augmenting my apps with AI ?

UX / Personalization



Business Processes Optimization

Do more with less



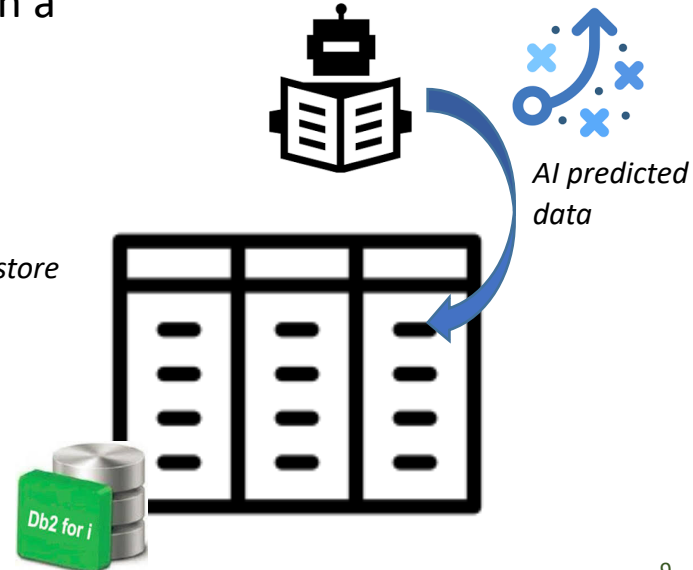
Gain competitive edge & Grow your Revenue



REVENUE

Why augmenting IBM i apps with AI ?

- Close relationship between AI , and “core business” data and applications. AI requires Data. *Data is the new Oil*
- IBM i : Platform of choice for hosting critical apps and data
→ locate AI models and mission-critical applications on a reliable & secure system.
- IBM i & AI cases and customer stories
 - Turnover Optimization - *The good product at the good store*
 - Fraud Detection – *transactional data at work*
 - Predictive Maintenance – *based on IoT data*
 - Harvest Prediction - *per land parcel in Tons*
 - Customer Churn prediction – *augmented CRM*
 - Chatbot – *helpdesk, customer support*



Example: Customer Churn

CRM & Customer Churn scenario

Customer Relationship Management - IBM i + Machine Learning Driverless AI MOJO Scoring Pipeline

Customers Dashboard

CUSTOMERID	GENDER	STREAMI...	CONTRACT	PAPERLE...	PAYMENT...	MONTHL...	TOTALCH...	CHURN?
7590-VHVEG	Female	No	Month-to-mon...	Yes	Electronic check	29.85	29.85	
5575-GNVDE	Male	No	One year	No	Mailed check	56.95	1889.50	
3668-QPYBK	Male	No	Month-to-mon...	Yes	Mailed check	53.85	108.15	
7795-CFOCW	Male	No	One year	No	Bank transfer (...)	42.30	1840.75	
9237-HQITU	Female	No	Month-to-mon...	Yes	Electronic check	70.70	151.65	
9305-CDSKC	Female	Yes	Month-to-mon...	Yes	Electronic check	99.65	820.50	
1452-KIOVK	Male	Yes	Month-to-mon...	Yes	Credit card (au...	89.10	1949.40	
6713-OKOMC	Female	No	Month-to-mon...	No	Mailed check	29.75	301.90	
7892-POOKP	Female	Yes	Month-to-mon...	Yes	Electronic check	104.80	3046.05	
6388-TABGU	Male	No	One year	No	Bank transfer (...)	56.15	3487.95	
9763-GRSKD	Male	No	Month-to-mon...	Yes	Mailed check	49.95	587.45	
7469-LKBCI	Male	No internet ser...	Two year	No	Credit card (au...	18.95	326.80	
8091-TTVAX	Male	Yes	One year	No	Credit card (au...	100.35	5681.10	
0280-XJGEX	Male	Yes	Month-to-mon...	Yes	Bank transfer (...)	103.70	5036.30	
5129-JLPIS	Male	Yes	Month-to-mon...	Yes	Electronic check	105.50	2686.05	
3655-SNQYZ	Female	Yes	Two year	No	Credit card (au...	113.25	7895.15	
8191-XWSZG	Female	No internet ser...	One year	No	Mailed check	20.65	1022.95	
9959-WOFKT	Male	Yes	Two year	No	Bank transfer (...)	106.70	7382.25	
4190-MFLUW	Female	No	Month-to-mon...	No	Credit card (au...	55.20	528.35	
4183-MYFRB	Female	No	Month-to-mon...	Yes	Electronic check	90.05	1862.90	
8779-QRDMV	Male	No	Month-to-mon...	Yes	Electronic check	39.65	39.65	
1680-VDCWW	Male	No internet ser...	One year	No	Bank transfer (...)	19.80	202.25	

RESET

SCORING

REFRESH



Initial CRM

No Customer Churn risk estimate per customer

Example: Customer Churn

CRM & Customer Churn scenario

Customer Relationship Management - IBM i + Machine Learning Driverless AI MOJO Scoring Pipeline

Customers Dashboard

CUSTOMERID	GENDER	STREAMI...	CONTRACT	PAPERLE...	PAYMENT...	MONTHL...	TOTALCH...	CHURN?
7590-VHVEG	Female	No	Month-to-mon...	Yes	Electronic check	29.85	29.85	0.21
5575-GNVDE	Male	No	One year	No	Mailed check	56.95	1889.50	0.26
3668-QPYBK	Male	No	Month-to-mon...	Yes	Mailed check	53.85	108.15	0.37
7795-CFOCW	Male	No	One year	No	Bank transfer (...)	42.30	1840.75	0.39
9237-HQITU	Female	No	Month-to-mon...	Yes	Electronic check	70.70	151.65	0.44
9305-CDSKC	Female	Yes	Month-to-mon...	Yes	Electronic check	99.65	820.50	0.27
1452-KIOVK	Male	Yes	Month-to-mon...	Yes	Credit card (au...	89.10	1949.40	0.23
6713-OKOMC	Female	No	Month-to-mon...	No	Mailed check	29.75	301.90	0.18
7892-POOKP	Female	Yes	Month-to-mon...	Yes	Electronic check	104.80	3046.05	0.30
6388-TABGU	Male	No	One year	No	Bank transfer (...)	56.15	3487.95	0.17
9763-GRSKD	Male	No	Month-to-mon...	Yes	Mailed check	49.95	587.45	0.15
7469-LKBCI	Male	No internet ser...	Two year	No	Credit card (au...	18.95	326.80	0.23
8091-TTVAX	Male	Yes	One year	No	Credit card (au...	100.35	5681.10	0.34
0280-XJGEX	Male	Yes	Month-to-mon...	Yes	Bank transfer (...)	103.70	5036.30	0.19
5129-JLPIS	Male	Yes	Month-to-mon...	Yes	Electronic check	105.50	2686.05	0.13
3655-SNQYZ	Female	Yes	Two year	No	Credit card (au...	113.25	7895.15	0.20
8191-XWSZG	Female	No internet ser...	One year	No	Mailed check	20.65	1022.95	0.13
9959-WOFKT	Male	Yes	Two year	No	Bank transfer (...)	106.70	7382.25	0.46
4190-MFLUW	Female	No	Month-to-mon...	No	Credit card (au...	55.20	528.35	0.17
4183-MYFRB	Female	No	Month-to-mon...	Yes	Electronic check	90.05	1862.90	0.52
8779-QRDMV	Male	No	Month-to-mon...	Yes	Electronic check	39.65	39.65	0.15
1680-VDCWW	Male	No internet ser...	One year	No	Bank transfer (...)	19.80	202.25	0.35

RESET

SCORING

REFRESH

Augmented CRM with AI
including Customer Churn risk estimate

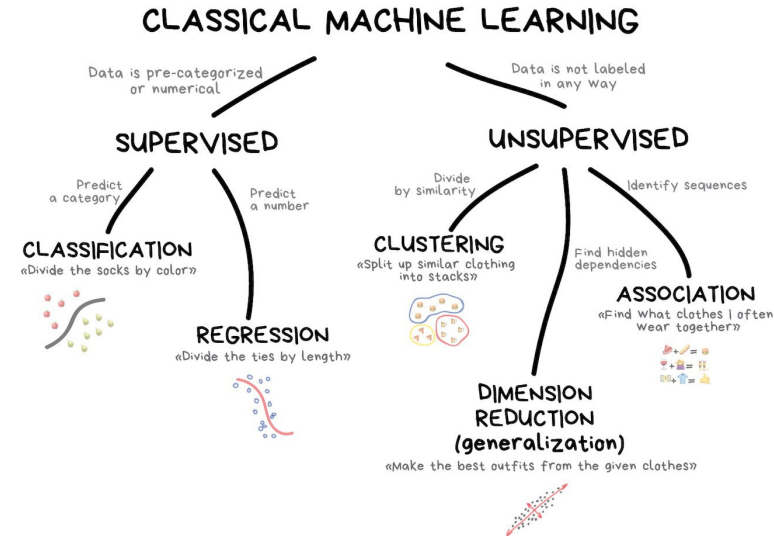
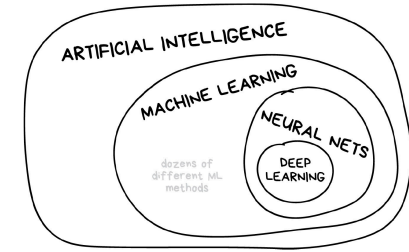


Machine Learning 101

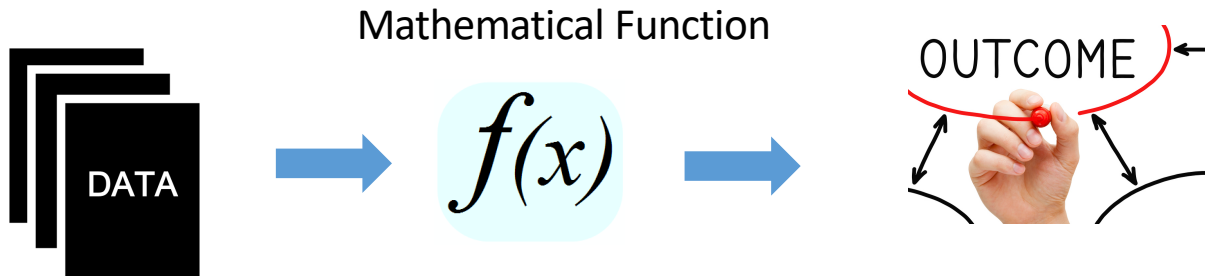


Machine Learning

- Born in the 1950's , ML relies on computing power, mathematics libraries and Data
- Learns from data, no explicit programming
- Establishes causation relationships in the data by 'observing' a phenomenon
- Data knowledge & expertise are necessary



Machine Learning



- Credit card transaction
- Loan application
- MRI image
- House data

- Fraudulent vs. legitimate
- Approve vs. reject
- Tumor benign vs. malignant
- House appraisal value

- Representing pattern by a mathematical function
- Machine learning is just a bunch of math

Machine Learning

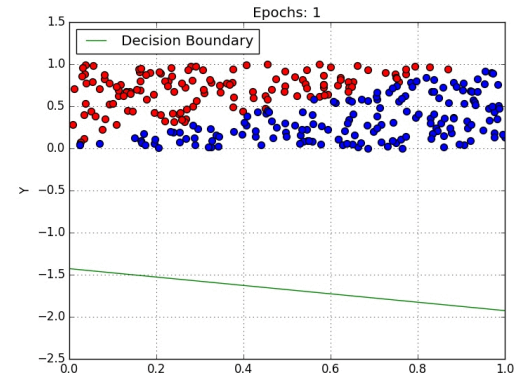
Loan Application Example

Feature				Label
				(values to predict in the future)
Loan Requested	Income	Own House	Outstanding Debt	Decision
\$20,000	\$100,000	Y	0	Approve
\$50,000	\$70,000	N	\$20,000	Reject
\$5,000	\$150,000	Y	\$10,000	Approve
...

$$\begin{matrix} x_1 \\ x_2 \\ x_3 \\ \dots \\ x_n \end{matrix} \begin{bmatrix} x_{11} & x_{12} & x_{13} & x_{14} \\ x_{21} & x_{22} & x_{23} & x_{24} \\ x_{31} & x_{32} & x_{33} & x_{34} \\ \dots & \dots & \dots & \dots \\ x_{n1} & x_{n2} & x_{n3} & x_{n4} \end{bmatrix} \begin{bmatrix} y_1 \\ y_2 \\ y_3 \\ \dots \\ y_n \end{bmatrix}$$

X

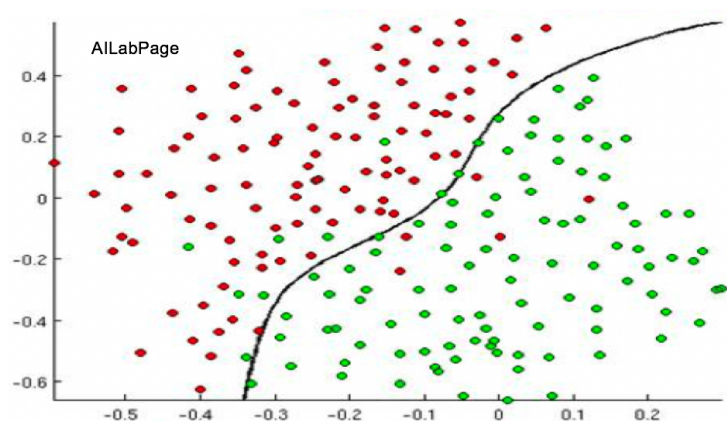
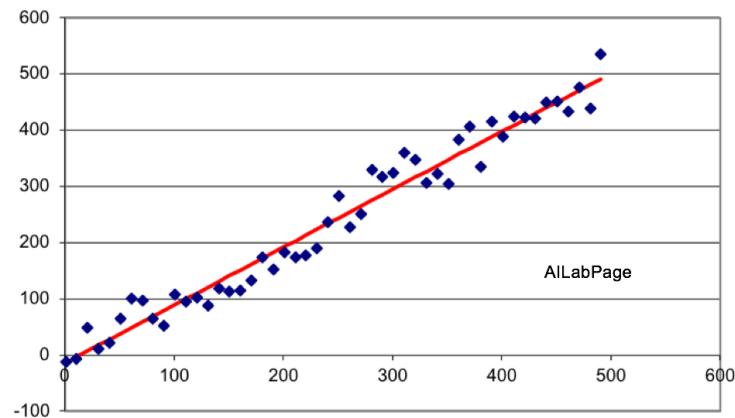
Y



AI Model training
(Classification)

- Learn from your data without explicitly coding the rules & relationships between X (features) and the decision Y
- Once trained, the optimal parameters (here, A and B matrices) are fixed and materialize the model (function f).

Machine Learning



Regression

The system attempts to predict a value for an input based on past data.

Example – 1. Temperature for tomorrow

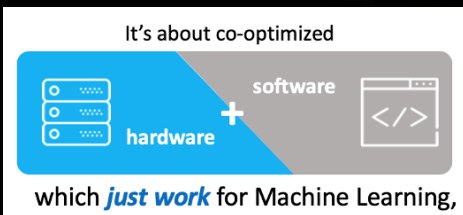


Classification

In classification, predictions are made by classifying them into different categories.

Example – 1. Type of cancer 2. Cancer Y/N

AI Solutions on IBM i



AI Tooling trends



1. Ready to Use – simple customization

Possible model re-training with your own data. (specialization)

Ex: Integration w/ Watson API (Chatbot , Image Processing, Text Processing etc.)



2. Auto ML

Bespoke accelerated modeling. Chargeable Licensed products

- H2O Driverless AI, SAS Viya, ...
- Cloud Pak for Data: IBM Watson Studio & AutoAI / CLPEX Optimization Studio

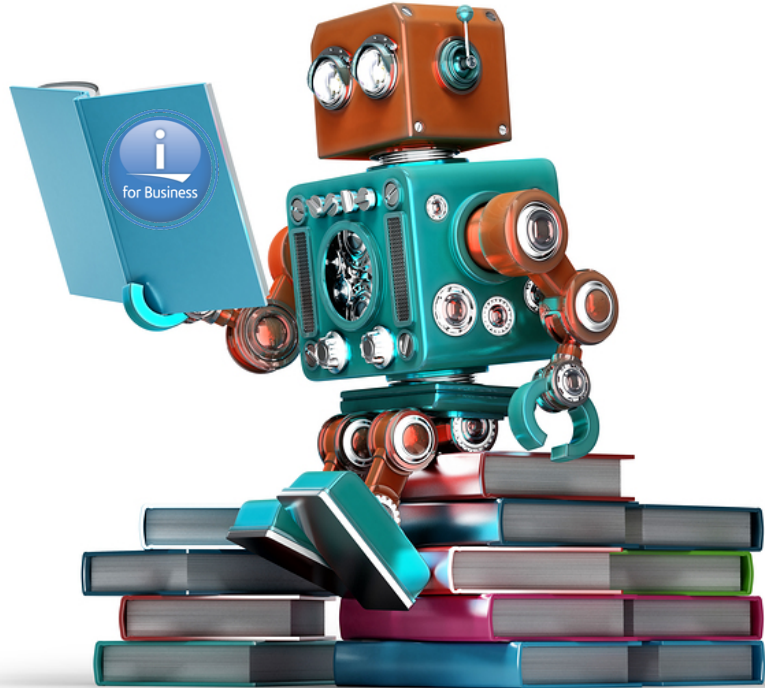


3. AI Libraries

Bespoke models, total control, free or licensed products.

- ML/DL : **Scikit learn**, **R**, Rstudio, H2O-3 , PyTorch, TensorFlow, Caffe , **Chainer** ...
- Apache Spark, Nvidia CUDA, KubeFlow, IBM Snap ML, Appliances (Nvidia, IBM AC922...), OpenCE, etc.

Relax...All you need is available on IBM i !



AI Applications on IBM i

*Dashboard (Web Query...) with additional insight ,
Augmented ERP, CRM, or Core business applications, etc.*



1. Ready to Use – simple customization

Ex: Watson Conversation/Translation REST API integrated with ILE/PASE/Db2
Training in the Cloud (IBM Cloud PaaS or Private with Cloud Pak for Data)



2. AI Libraries & tools in PASE

PASE Libraries : **Scikit learn**, **R**, **NLTK** , etc.



3. Assisted ML : Auto ML

Ex: AutoML models running (inference) in PASE (Scikit learn auto-sklearn etc)
H2O Driverless AI Scoring Pipeline running in PASE (Java, Python) / Db2 Java UDF
Inference: PASE \leftrightarrow ILE Integration
Training in PASE or offloaded on Linux/other Clouds.

IBM Solutions : AI/ML/DL



Data Engineer

Free Open Source on IBM i /AIX



Structured Data

Tabular data: IoT/Logs/Database
Acceleration & **AutoML** with Driverless AI

AutoML "Data Scientist in a Box"
Training on Linux , Scoring on AIX/IBM i !



WML

All use cases

Program your models w/ Open source
& **Accelerated** HW . Scale w/o limit

Vision/Acoustic

Retail/Inspection
/Security, Quality...



WML
























All use cases

AI Cockpit
AutoML

AutoML
Multi-Cloud (Private/Public)



	Open Source Libraries AIX / IBM i	H ₂ O ^{ai} Driverless AI	Open-CE	WML-A	Visual Insights	WML Studio
Description	ML on IBM i /AIX No GPU, runs on CPUs Traditional datasets, Relevant for Model Inference (production) Enrichable with Watson Services	Auto Machine learning Simplified deployment,, automatic pipelines, model "explainability", end to end automation Inference:  	Free, Easy to install High Performance DL LMS (Large Model) DDL (Distributed)  	Enterprise Solution for Deep Learning – Advanced Features : DDL 4+ Nodes... HPC Job Scheduler	Ready to use Deep Learning with Video tools Train/Infer/Edge	Collaborative ML/DL WML dev & deployment AutoAI Use WMLCE if installed Can Use WML-A plugin
Support	Available from IBM	H2O L 1-3	Available from IBM	IBM L 1-3 Included	IBM L1-3 Included	Available from IBM
Environments Server Technologies	AIX , IBM i, Linux   	x86, IC/AC922, LC9xx   	x86/AC922/ IC922   	x86/AC922/ IC922  	x86/AC922/ IC922   	x86/AC922/ IC922   



+

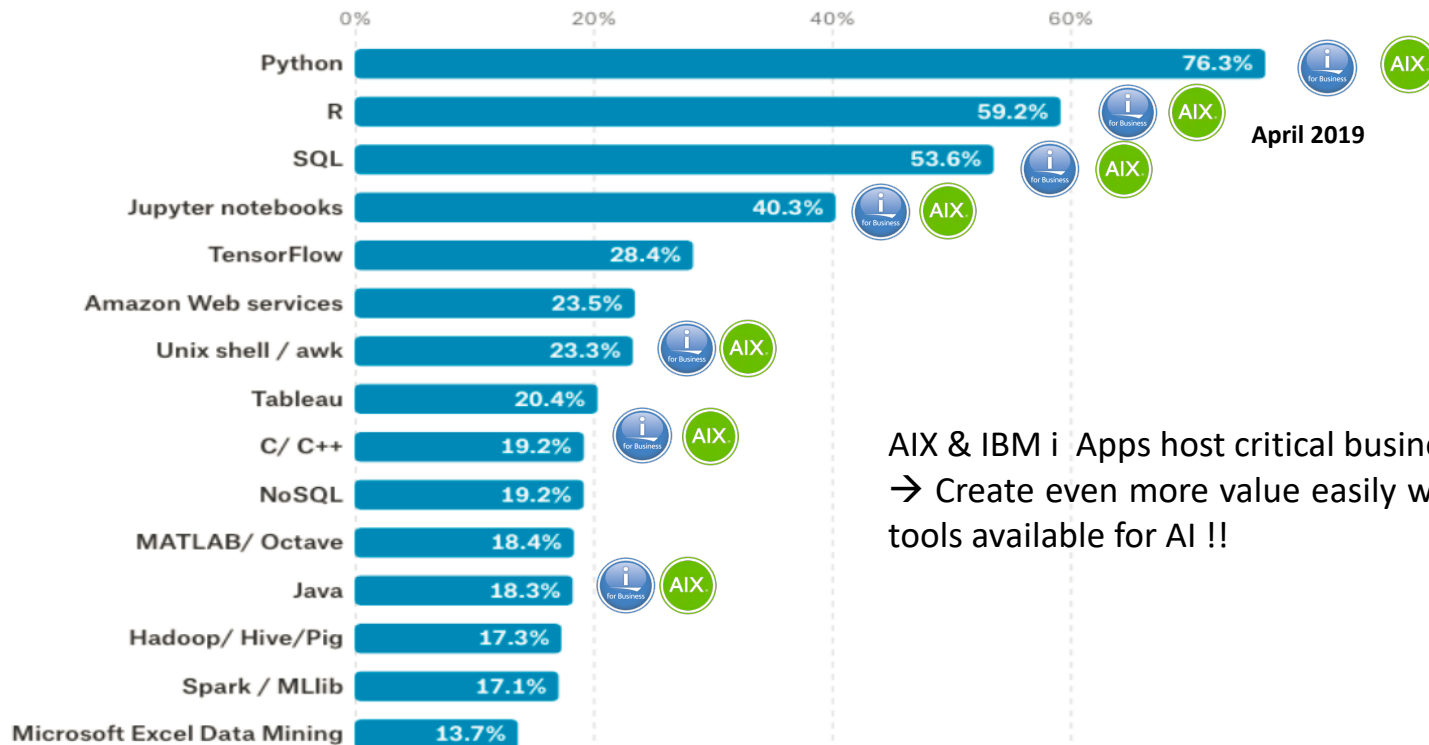


OPENSIFT

AI technologies available on IBM i

What tools do you use for AI & Analytics projects ?

AI - Kaggle Survey results 2017



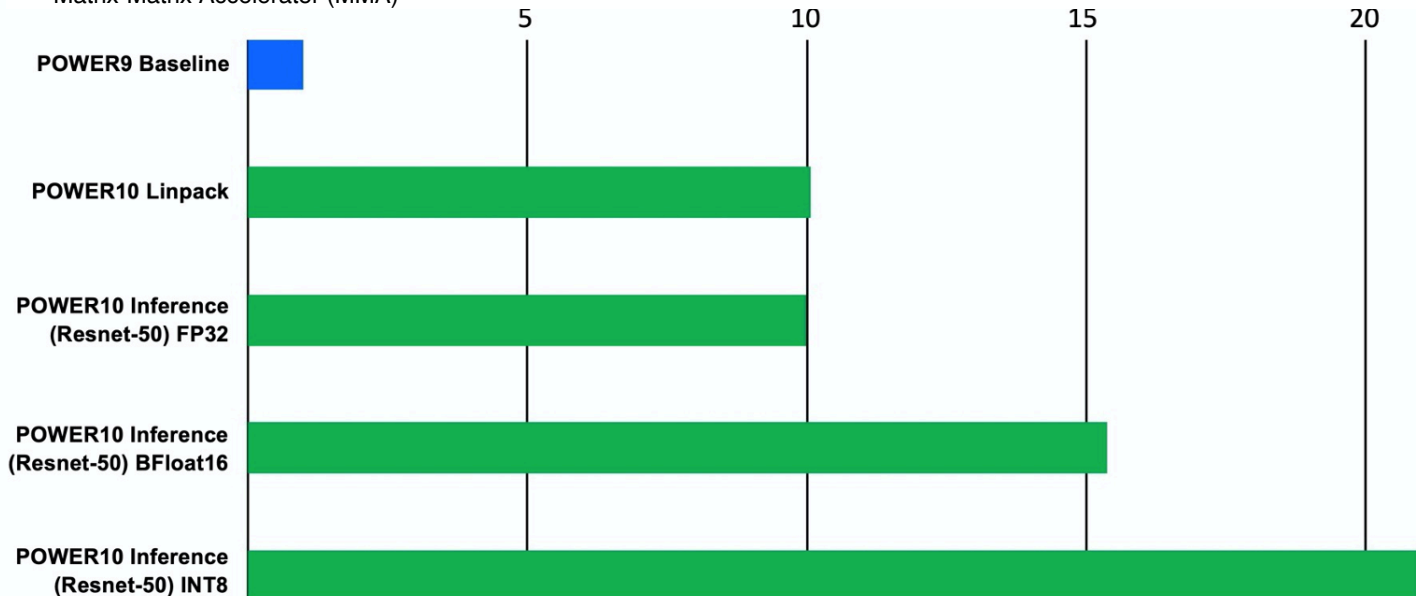
April 2019

AIX & IBM i Apps host critical business data
→ Create even more value easily with Open Source tools available for AI !!

Analytics, AI & IBM Systems: What's next after POWER9?

POWER10 SIMD / AI Socket Performance Gains

Matrix-Matrix Accelerator (MMA)

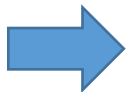


→ AI Infusion into Enterprise Databases (Oracle, SAP, DB2)

→ AutoAI & Advanced Analytics : H2O, SAS Viya, IBM Cloud Pak for Data

AI Applications on IBM i

*Dashboard (Web Query...) with additional insight ,
Augmented ERP, CRM, or Core business applications, etc.*



1. Ready to Use – simple customization

Ex: Watson Conversation/Translation REST API integrated with ILE/PASE/Db2
Training in the Cloud (IBM Cloud PaaS or Private with Cloud Pak for Data)

2. AI Libraries & tools in PASE

PASE Libraries : **Scikit learn**, **R**, **NLTK** , etc.

3. Assisted ML : Auto ML

Ex: AutoML models running (inference) in PASE (Scikit learn auto-sklearn etc)

H2O Driverless AI Scoring Pipeline running in PASE (Java, Python) / Db2 Java UDF

Inference: PASE \leftrightarrow ILE Integration
























Training in PASE or offloaded on Linux/other Clouds.

1_AI Model consumption – IBM Watson API Example

- NLP, translation, tonality
- Documents (annotations..)
- images
- Voice

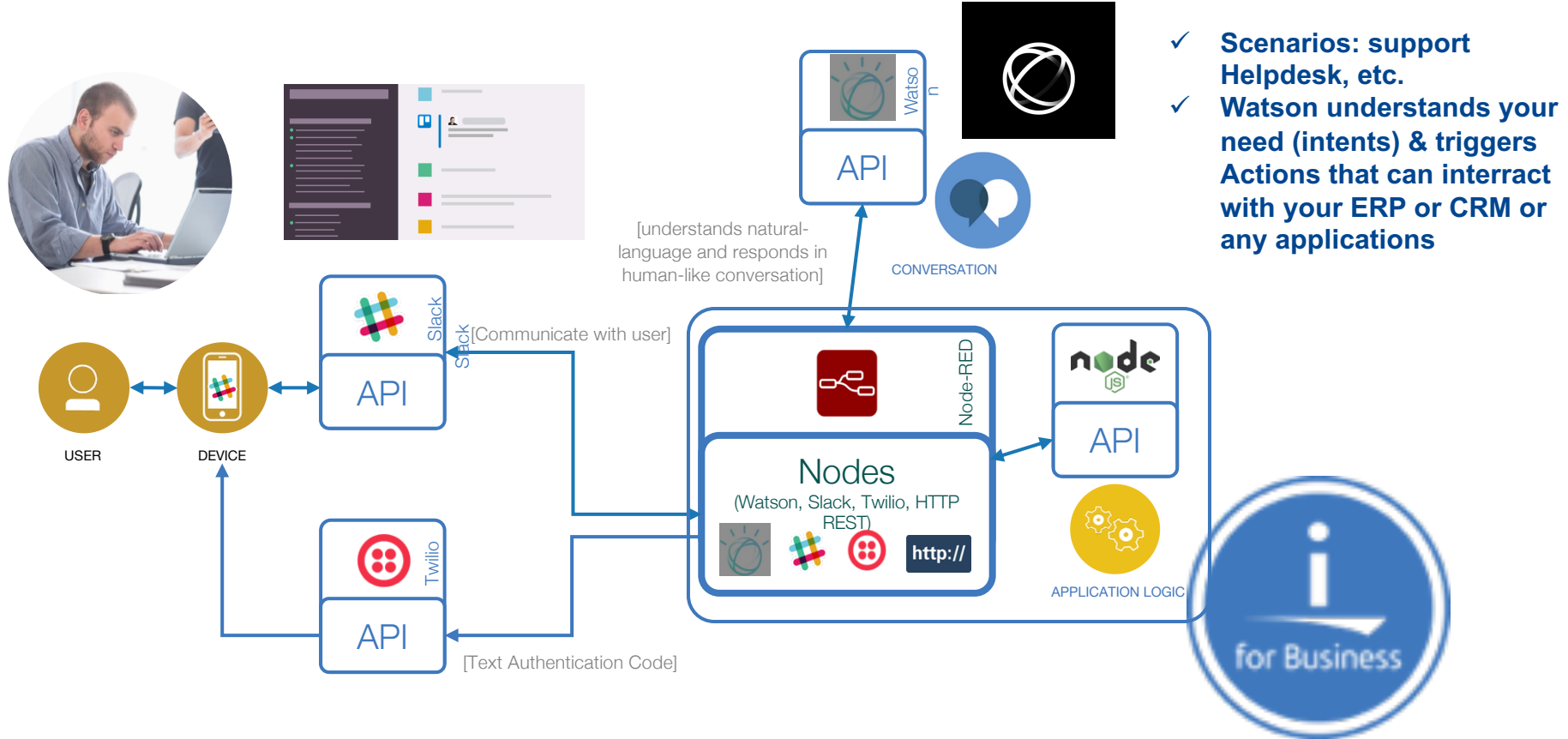
Integration via REST API or via Db2 for I data connector

Available on any Cloud (AWS, IBM, Azure, On Premise...)

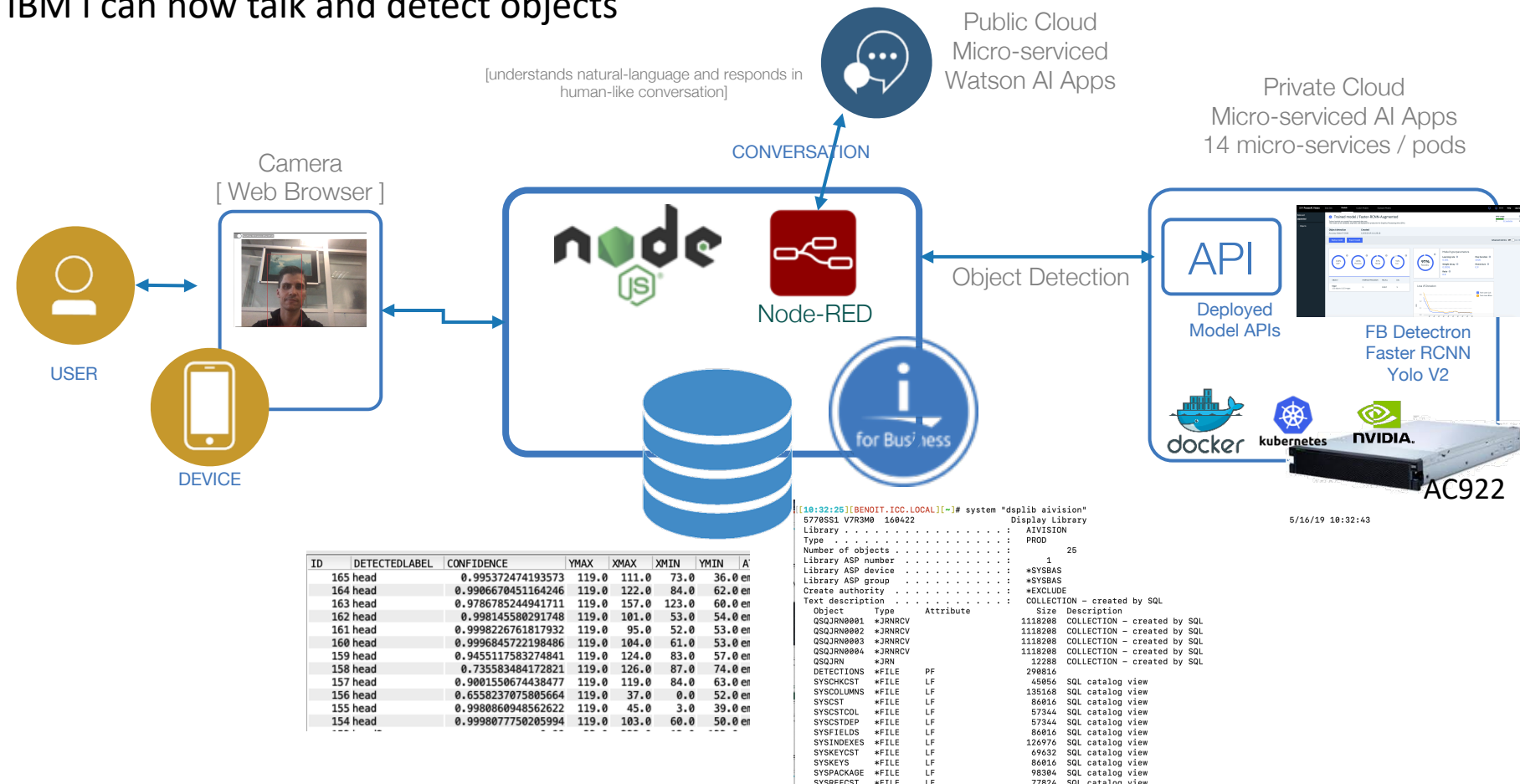
 Watson Assistant IBM • Services • AI / Machine Learning Watson Assistant lets you build conversational interfaces into any application, device, or channel. Lite • Free • IAM-enabled	 Watson Knowledge Catalog IBM • Services • AI / Machine Learning Discover, catalog, and securely share enterprise data. Lite • Free • IAM-enabled	 Watson OpenScale IBM • Services • AI / Machine Learning IBM Watson OpenScale is an enterprise-grade environment for AI infused applications that provides enterprises... Lite • Free • IAM-enabled	 Watson Studio IBM • Services • AI / Machine Learning Embed AI and machine learning into your business. Create custom models using your own data. Lite • Free • IAM-enabled	 Voice Agent with Watson IBM • Services • AI / Machine Learning Create a cognitive voice agent that uses Watson services to speak directly with customers using natural language over... Lite • Free • IAM-enabled	 Custom Vision Model for Core ML with Watson IBM • Software • AI / Machine Learning Create Apple Core ML Models using the Watson Visual Recognition service to process and tag images locally. Starter kits
 Machine Learning IBM • Services • AI / Machine Learning IBM Watson Machine Learning - make smarter decisions, solve tough problems, and improve user outcomes. Lite • Free • IAM-enabled • Service Endpoint Supported	 Personality Insights IBM • Services • AI / Machine Learning The Watson Personality Insights derives insights from transactional and social media data to identify psychological... Lite • Free • IAM-enabled	 Knowledge Studio IBM • Services • AI / Machine Learning Teach Watson the language of your domain. Lite • Free • IAM-enabled	 Compare and Comply IBM • Services • AI / Machine Learning Process governing documents to convert, identify, classify, and compare important elements Lite • Free • IAM-enabled	 Natural Language Understanding Node.js App IBM • Software • AI / Machine Learning Collection of APIs that can analyze text to help you understand its concepts, entities, keywords, sentiment, and can... Starter kits • IBM Kubernetes Service • Red Hat OpenShift	 Visual Recognition Node.js App IBM • Software • AI / Machine Learning Use deep learning algorithms to analyze images that can give you insights into your visual content. Starter kits • IBM Kubernetes Service • Red Hat OpenShift
 Annotator for Clinical Data IBM • Services • AI / Machine Learning Analyze text to extract medical codes and concepts such as diseases, lab values, medications, procedures and more. Lite • Free • IAM-enabled • Service Endpoint Supported	 Master Data Management IBM • Services • AI / Machine Learning • Analytics • Databases • Mobile IBM Master Data Management (MDM) a fully cloud native SaaS offering, offers critical capabilities to manage your... Lite • Free • IAM-enabled • Beta	 Discovery IBM • Services • AI / Machine Learning Add a cognitive search and content analytics engine to applications. Lite • Free • IAM-enabled	 Language Translator IBM • Services • AI / Machine Learning Translate text, documents, and websites from one language to another. Create industry or region-specific translations... Lite • Free • IAM-enabled	 Natural Language Understanding IBM • Services • AI / Machine Learning Analyze text to extract meta-data from content such as concepts, entities, emotion, relations, sentiment and more. Lite • Free • IAM-enabled	 Natural Language Classifier IBM • Services • AI / Machine Learning Natural Language Classifier uses advanced natural language processing and machine learning techniques to... Free • IAM-enabled
 Speech to Text IBM • Services • AI / Machine Learning Low-latency, streaming transcription	 Text to Speech IBM • Services • AI / Machine Learning Synthesizes natural-sounding speech from text.	 Tone Analyzer IBM • Services • AI / Machine Learning Tone Analyzer uses linguistic analysis to detect three types of tones from communications: emotion, social, and...	 Visual Recognition IBM • Services • AI / Machine Learning Find meaning in visual content! Analyze images for scenes, objects, and other content. Choose a default model off the...	 Domain Name Registration IBM • Services • Developer Tools IBM Cloud offers domain registration services complete with dedicated support staff, knowledgeable customer service,...	

1_ AI Model consumption – IBM Watson API Example

Chabot (Assistant) on IBM i

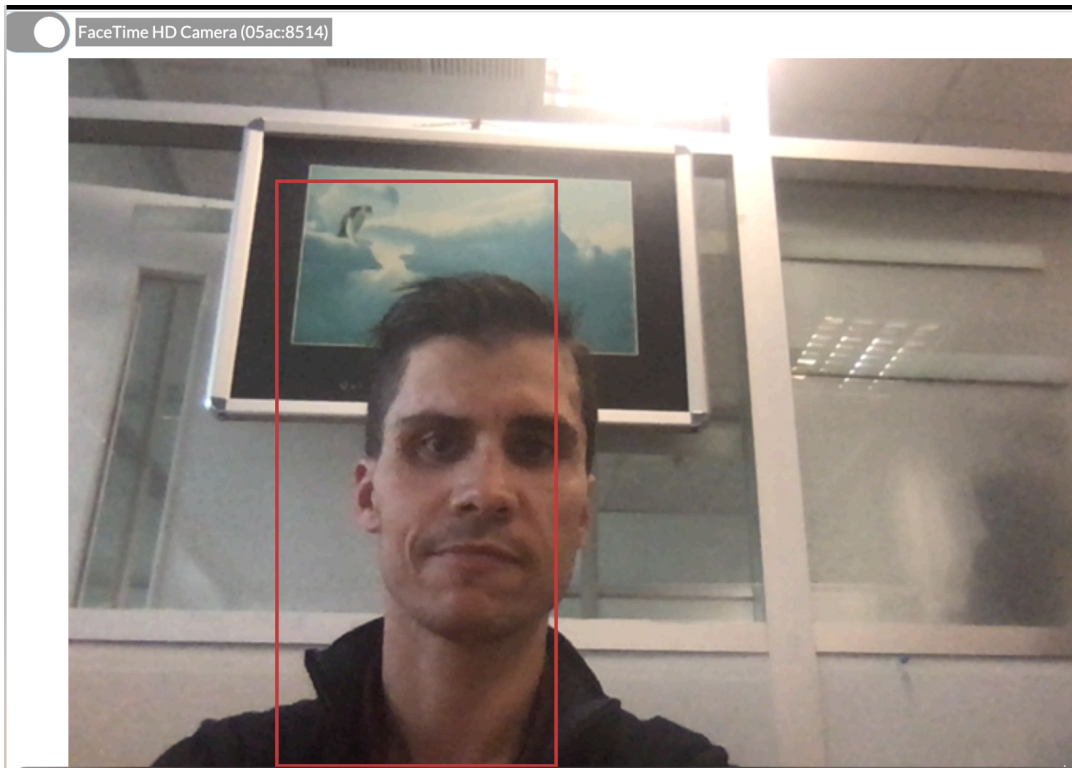


IBM i can now talk and detect objects



Computer Vision on IBM i

IBM i can now talk and detect objects



Visual Recognition Demo on IBM i + PowerAI Vision



nodejs
PowerAI Vision

Do try this at home!

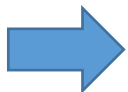
<https://github.com/bmarolleau/paiv-ibmi>
(need to be adapted if IBM Visual Insights is not used ☺)

AI Applications on IBM i

*Dashboard (Web Query...) with additional insight ,
Augmented ERP, CRM, or Core business applications, etc.*

1. Ready to Use – simple customization

Ex: Watson Conversation/Translation REST API integrated with ILE/PASE/Db2
Training in the Cloud (IBM Cloud PaaS or Private with Cloud Pak for Data)



2. AI Libraries & tools in PASE

PASE Libraries : **Scikit learn**, **R**, **NLTK** , etc.

3. Assisted ML : Auto ML

Ex: AutoML models running (inference) in PASE (Scikit learn auto-sklearn etc)
H2O Driverless AI Scoring Pipeline running in PASE (Java, Python) / Db2 Java UDF
Inference: PASE \leftrightarrow ILE Integration
Training in PASE or offloaded on Linux/other Clouds.

2_ Free Open Source on IBM i

Libraries & languages on AIX & IBM i

Data & Scientific Packages Available

Numpy, Pandas : Data Processing

Scipy, Scikit-Learn

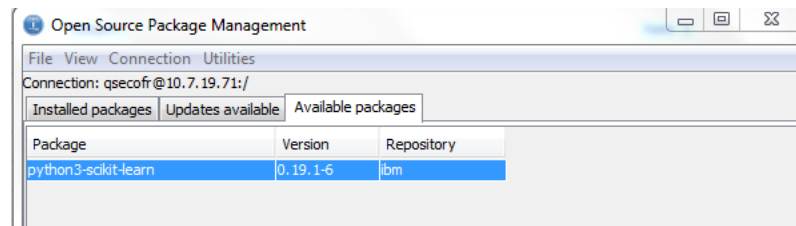
IPython : interactive Python

[NLTK](#) : Natural Language Processing

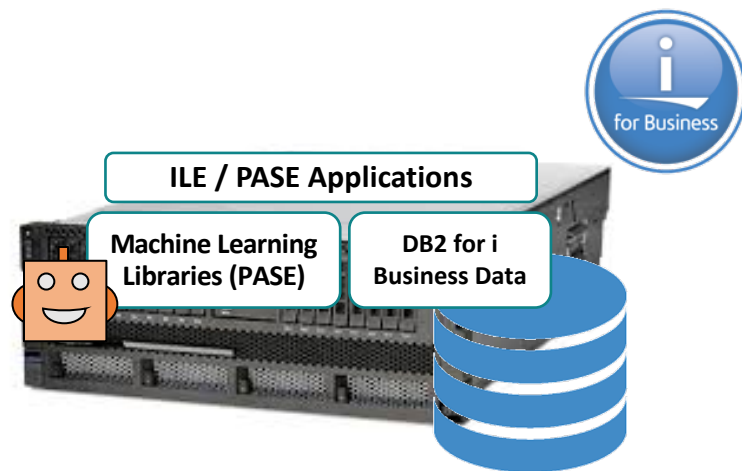
Matplotlib, Jupyter : Data Visualization

R Language (Interpreter, Runtime)

More to come? 😊



- ➔ Useful in all phases of a ML project on AIX/IBM i
- ➔ Data Visualization/ Preparation
- ➔ Model creation , training, inference as well
- ➔ **GPU Acceleration often needed for large datasets (price / performance) → IC922 / AC922 + WML-CE**



Free Open Source on IBM i

scikit-learn



Classification

Identifying to which category an object belongs to.

Applications: Spam detection, Image recognition.

Algorithms: SVM, nearest neighbors, random forest, ... — Examples

Regression

Predicting a continuous-valued attribute associated with an object.

Applications: Drug response, Stock prices.

Algorithms: SVR, ridge regression, Lasso, ... — Examples

Clustering

Automatic grouping of similar objects into sets.

Applications: Customer segmentation, Grouping experiment outcomes

Algorithms: k-Means, spectral clustering, mean-shift, ... — Examples

Dimensionality reduction

Reducing the number of random variables to consider.

Applications: Visualization, Increased efficiency

Algorithms: PCA, feature selection, non-negative matrix factorization. — Examples

Model selection

Comparing, validating and choosing parameters and models.

Goal: Improved accuracy via parameter tuning

Modules: grid search, cross validation, metrics. — Examples

Preprocessing

Feature extraction and normalization.

Application: Transforming input data such as text for use with machine learning algorithms.

Modules: preprocessing, feature extraction. — Examples

Free Open Source on IBM i

- Packages to install – 1.2 GB

Yum Install
(*ALLOBJ)

Package (RPM)	Description
Tcl	TCL language support
Tk	TK package for GUI support of TCL
Python3	Python 3 support
Python3-devel	Python3 development package
python3-ibm_db	DBAPI support package for IBM i
Python3-numpy	Numpy package
Python3-scipy	Scipy package
Python3-scikit-learn	Scikit-learn package
Libzmq	Zero-MQ library

Package Python
(user)

Package Python (PIP)	Description
jupyterlab	Includes jupyter (Julia/Python/R IDE)
joblib	Model and large objects persistence on Filesystem



Free Open Source on IBM i

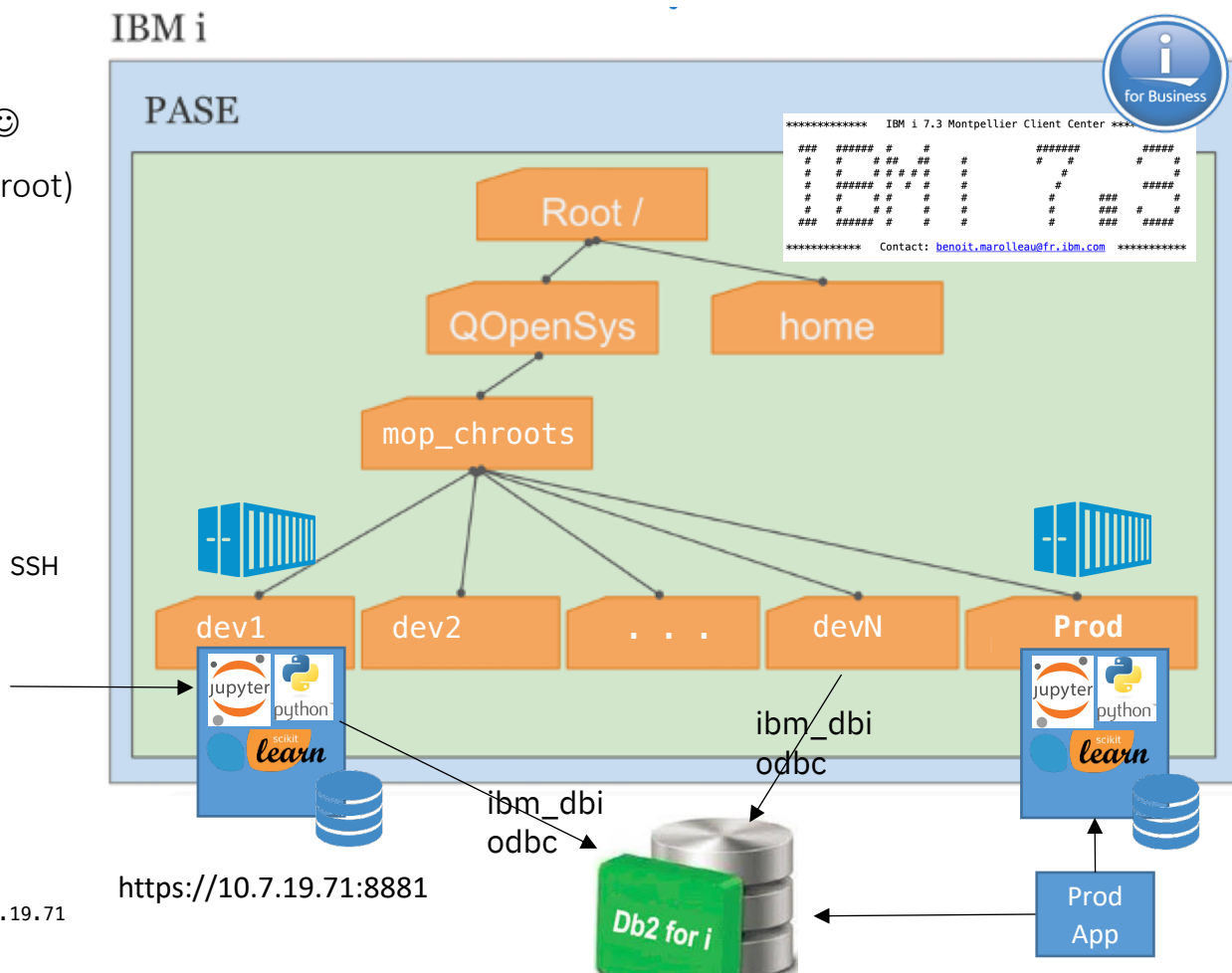
DevOps setup for AI

- Chroot jails (Isolation in PASE/IFS) ☺
- n Data Scientists = n sand boxes (chroot)
- Dev + Ops Environments
- 1.2GB per Scikit-learn environment
- Rest of the system (/) isolated

```
yum install
--installroot /QOpenSys/mop_chroots/dev1
tcl
tk
python3
python3-devel
python3-ibm_db
python3-numpy
python3-scipy
python3-scikit-learn
python3-pyzmq
libzmq
python3-pip
python3-pandas
openssl
bash
```

```
ssh dev1@BENOIT.ICC.LOCAL
bash-4.4$ pip3 install jupyterlab
bash-4.4$ pip3 install joblib
```

```
bash-4.4$ jupyter notebook --port 8881 --ip 10.7.19.71
```



Free Open Source on IBM i Model Training with data from Db2 for i

10.7.19.71:8889/notebooks/scikit-learn-lab/Churn-IBMi.ipynb

... ⌵ ☆

Jupyter Churn-IBMi Last Checkpoint: Last Thursday at 4:19 PM (autosaved)

Logout

File Edit View Insert Cell Kernel Help Trusted Python 3

⏏ + 🔍 ↺ ↻ ⬆ ⬇ ▶ Run ■ ↺ ▶ Markdown ⓘ

Machine Learning on IBM i with Scikit Learn, pandas (0.22) and Db2 for i

Original notebook: <https://github.com/IBM/customer-churn-prediction/blob/master/notebooks/customer-churn-prediction.ipynb>

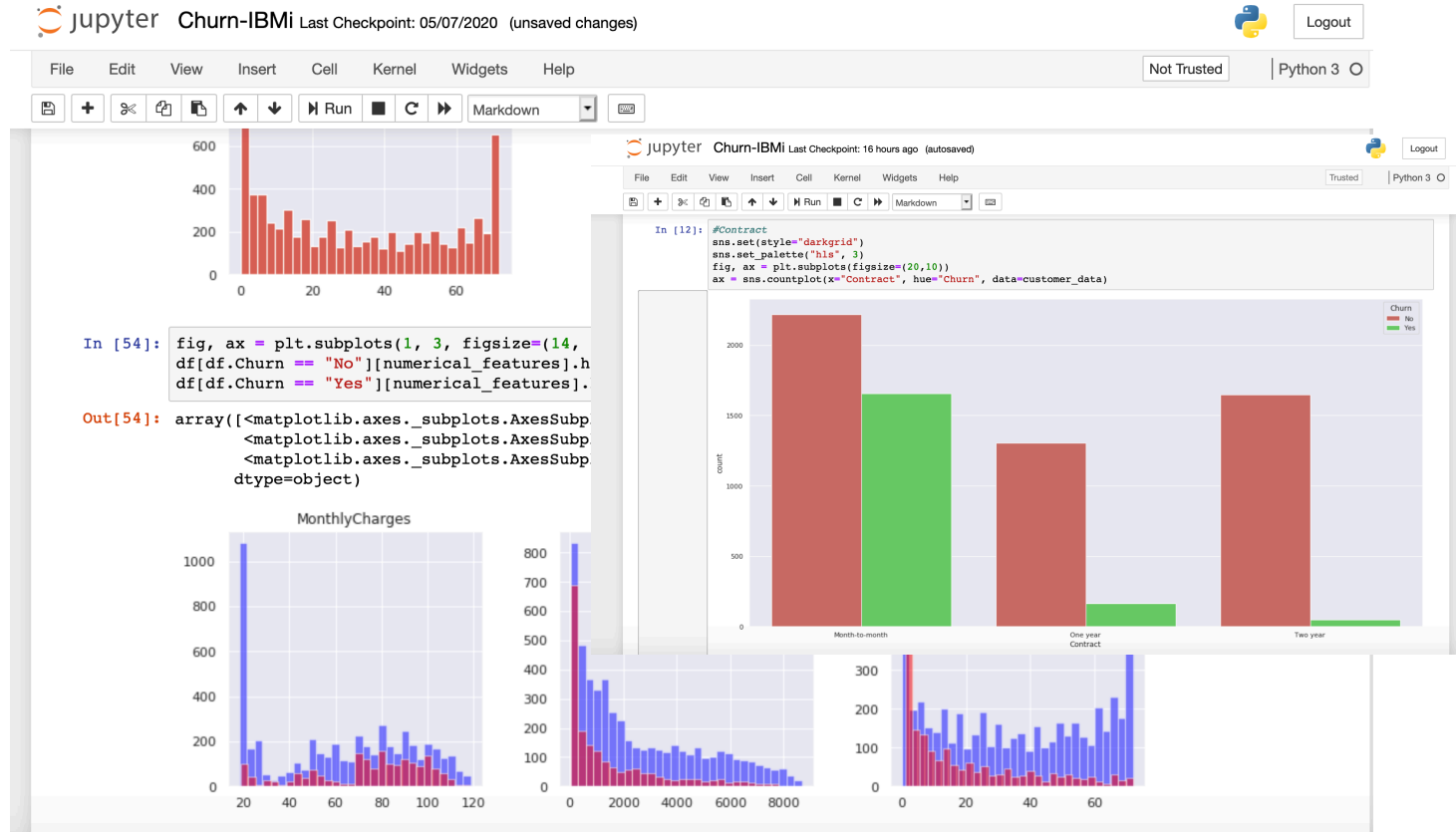
```
In [1]: %pwd  
Out[1]: '/home/scikit-learn-lab'  
  
In [9]: # Download the original dataset if necessary  
#!wget https://community.watsonanalytics.com/wp-content/uploads/2015/03/WA_Fn-UseC_-Telco-Customer-Churn.csv --no-check-certificate
```

Load Dataframe from Db2

```
In [2]: import ibm_db_dbi as dbi  
import pandas as pd  
  
# Telco Churn dataset from a CRM datasource - here Db2 for i in CHURN/CUSTCHURN2 7044 records  
  
sql="SELECT * from CHURN.CUSTCHURN3"  
pd.set_option('display.max_columns', 30)  
try:  
    conn = dbi.connect()  
    df_fromdb2 = pd.read_sql(sql, conn)  
    df_fromdb2  
    df_fromdb2.info()
```

Free Open Source on IBM i

Analytics Dashboard, Data preparation



Free Open Source on IBM i

Model integration with your applications (GO LIVE)

1. Model Training/Validation (on IBM i or not)
2. Model transfer & loading to IBM i (IFS/JFS)
3. Scoring (Inference) on IBM i (PASE)
4. Integration of the model in your app

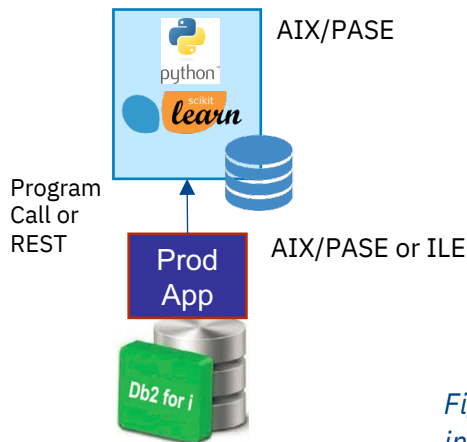


Fig. 20 client Scoring in PASE (Python3)

Using production data

The screenshot shows a Jupyter Notebook interface with the title 'Churn-IBMi'. The notebook contains two sections: 'Load trained model' and 'Test the Model - Model Inference on IBM i'. The code in the first section loads a trained model using joblib. The code in the second section performs inference on a test dataset and prints the results.

```
Load trained model

Python Application can use the created model

In [40]: from joblib import load
clf_svc = load('SVC_Model_CHURN_IBMi_V1.joblib')
```

```
Test the Model - Model Inference on IBM i

In [43]: #Xinfer=DataFrame(X_train_scaled, columns=X_train.columns).head(20).values
#infer=clf_svc.predict(Xinfer)
#[0 0 0 1 0 1 0 0 0 0 0 1 0 1 0 0 0 0]

#X_train_scaled.shape
#(4718, 25)

X_test_scaled.shape
#(2325, 25)
print("Testing model on IBM i")
print("Test Dataset:")
#print(X_test_scaled)

Xinfer=pd.DataFrame(X_test_scaled, columns=X_train.columns).head(20).values
print("IBM i Scikit Learn Scoring on 20 new Customers ")
print(clf_svc.predict(Xinfer))
#[1 0 0 1 0 0 0 0 0 0 0 0 0 1 0 1 1 0 1]

Testing model on IBM i
Test Dataset:
IBM i Scikit Learn Scoring on 20 new Customers
[1 0 0 1 0 0 0 0 0 0 0 0 0 1 0 1 1 0 1]

In [42]: print(clf_svc.predict_proba(Xinfer))

[[0.27807305 0.72192695]
 [0.84525602 0.15474398]
 [0.8468064 0.1531936 ]
 [0.31472176 0.68527824]
 [0.8481302 0.1518698 ]
 [0.86909208 0.13090792]
 [0.84684585 0.15319415]
 [0.84687523 0.15312477]]
```

Free Open Source on IBM i : Smarter apps made easy

CRM & Customer Churn scenario

Customer Relationship Management - IBM i + Machine Learning Driverless AI MOJO Scoring Pipeline

Customers Dashboard

CUSTOMERID	GENDER	STREAMI...	CONTRACT	PAPERLE...	PAYMENT...	MONTHL...	TOTALCH...	CHURN?
7590-VHVEG	Female	No	Month-to-mon...	Yes	Electronic check	29.85	29.85	0.21
5575-GNVDE	Male	No	One year	No	Mailed check	56.95	1889.50	0.26
3668-QPYBK	Male	No	Month-to-mon...	Yes	Mailed check	53.85	108.15	0.37
7795-CFOCW	Male	No	One year	No	Bank transfer (...)	42.30	1840.75	0.39
9237-HQITU	Female	No	Month-to-mon...	Yes	Electronic check	70.70	151.65	0.44
9305-CDSKC	Female	Yes	Month-to-mon...	Yes	Electronic check	99.65	820.50	0.27
1452-KIOVK	Male	Yes	Month-to-mon...	Yes	Credit card (au...	89.10	1949.40	0.23
6713-OKOMC	Female	No	Month-to-mon...	No	Mailed check	29.75	301.90	0.18
7892-POOKP	Female	Yes	Month-to-mon...	Yes	Electronic check	104.80	3046.05	0.30
6388-TABGU	Male	No	One year	No	Bank transfer (...)	56.15	3487.95	0.17
9763-GRSKD	Male	No	Month-to-mon...	Yes	Mailed check	49.95	587.45	0.15
7469-LKBCI	Male	No internet ser...	Two year	No	Credit card (au...	18.95	326.80	0.23
8091-TTVAX	Male	Yes	One year	No	Credit card (au...	100.35	5681.10	0.34
0280-XJGEX	Male	Yes	Month-to-mon...	Yes	Bank transfer (...)	103.70	5036.30	0.19
5129-JLPIS	Male	Yes	Month-to-mon...	Yes	Electronic check	105.50	2686.05	0.13
3655-SNQYZ	Female	Yes	Two year	No	Credit card (au...	113.25	7895.15	0.20
8191-XWSZG	Female	No internet ser...	One year	No	Mailed check	20.65	1022.95	0.13
9959-WOFKT	Male	Yes	Two year	No	Bank transfer (...)	106.70	7382.25	0.46
4190-MFLUW	Female	No	Month-to-mon...	No	Credit card (au...	55.20	528.35	0.17
4183-MYFRB	Female	No	Month-to-mon...	Yes	Electronic check	90.05	1862.90	0.52
8779-QRDMV	Male	No	Month-to-mon...	Yes	Electronic check	39.65	39.65	0.15
1680-VDCWW	Male	No internet ser...	One year	No	Bank transfer (...)	19.80	202.25	0.35

RESET

SCORING

REFRESH

Augmented CRM with AI
including Customer Churn risk estimate

AI Applications on IBM i

*Dashboard (Web Query...) with additional insight ,
Augmented ERP, CRM, or Core business applications, etc.*

1. Ready to Use – simple customization

Ex: Watson Conversation/Translation REST API integrated with ILE/PASE/Db2
Training in the Cloud (IBM Cloud PaaS or Private with Cloud Pak for Data)

2. AI Libraries & tools in PASE

PASE Libraries : **Scikit learn**, **R**, **NLTK** , etc.

3. Assisted ML : Auto ML



Ex: AutoML models running (inference) in PASE (Scikit learn auto-sklearn etc)
H2O Driverless AI Scoring Pipeline running in PASE (Java, Python) / Db2 Java UDF
Inference: PASE \leftrightarrow ILE Integration
Training in PASE or offloaded on Linux/other Clouds.

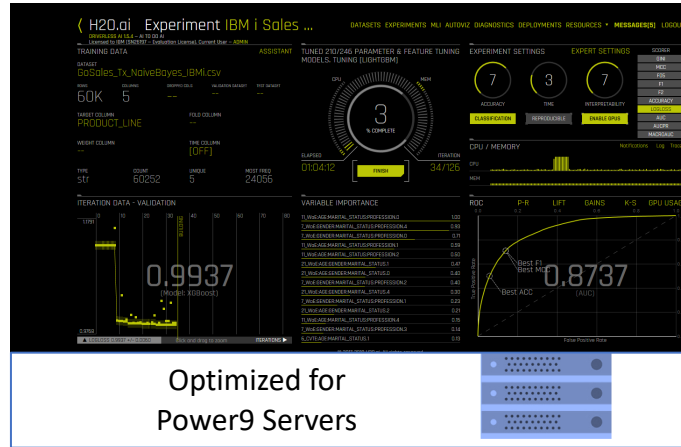
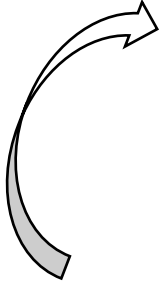
3_Auto ML

Example with H2O Driverless AI



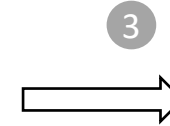
Import & Visualize Data
Create & Test Models

1
Extract
CRM data



5
Monitor Models
& Iterate

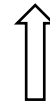
Model Export




3
Recommendation Engine
Scoring Pipeline



4
Augment IBM i Applications
Model Inference



Une Solution simple et abordable :
→ “Expert Data Scientist in a Box”
→ Months down to Hours
→ Explainability & Transparency



Business Database

Customer Relationship Management - IBM i + Machine Learning Driverless AI MOJO Scoring Pipeline

RESET SCORING REFRESH

Customer Dashboard

CUSTOM...	GENDER	STREAMI...	CONTRACT	PAPERLE...	PAYMENT...	MONTHL...	TOTALCH...	CHURN?
0002-ORFBO	Female	Yes	One year	Yes	Mailed check	65.60	593.30	0.21
0003-MKNFE	Male	No	Month-to-mon...	No	Mailed check	59.90	542.40	0.26
0004-TLHLJ	Male	No	Month-to-mon...	Yes	Electronic check	73.90	280.85	0.37
0011-IGKFF	Male	Yes	Month-to-mon...	Yes	Electronic check	98.00	1237.85	0.39
0013-EXCHZ	Female	Yes	Month-to-mon...	Yes	Mailed check	83.90	267.40	0.44
0013-MHZWF	Female	Yes	Month-to-mon...	Yes	Credit card (au...	69.40	571.45	0.27
0013-SMEOE	Female	Yes	Two year	Yes	Bank transfer (...)	109.70	7904.25	0.23

Business Application

Smarter IBM i apps made easy with Driverless AI

Dataset creation from Db2 for i

Prepared
Training
Dataset

```
Untitled* - Run SQL Scripts - 10.7.19.71(001dd6f4)
File Edit View Run VisualExplain Monitor Options Connection Tools Help
1 select * from churn.custchurn3
```

ACKUP	DEVICEPROTECTION	TECHSUPPORT	STREAMINGTV	STREAMINGMOVIES	CONTRACT	PAPERLESSBILLING	PAYMENTMETHOD	MONTHLYCHARGES	TOTALCHARGES	CHURN
No	No	No	No	No	Month-to-month	Yes	Electronic check	29.85	29.85	No
Yes	No	No	No	No	One year	No	Mailed check	56.95	1889.50	No
No	No	No	No	No	Month-to-month	Yes	Mailed check	53.85	108.15	Yes
Yes	Yes	No	No	No	One year	No	Bank transfer (automatic)	42.30	1840.75	No
No	No	No	No	No	Month-to-month	Yes	Electronic check	70.70	151.65	Yes
Yes	No	Yes	Yes	Yes	Month-to-month	Yes	Electronic check	99.65	820.50	Yes
No	No	Yes	No	No	Month-to-month	Yes	Credit card (automatic)	89.10	1949.40	No
No	No	No	No	No	Month-to-month	No	Mailed check	29.75	301.90	No
Yes	Yes	Yes	Yes	Yes	Month-to-month	Yes	Electronic check	104.80	3046.05	Yes
..	No	No	No	No	One year	No	Bank transfer (automatic)	56.15	3487.95	No
	No	No	No	No	Month-to-month	Yes	Mailed check	49.95	587.45	No
	No	No	No	No	Two year	No	Credit card (automatic)	18.95	326.80	No

Extraction
or JDBC
Data Connector

H₂O.ai

0502 DATASET OVERVIEW

PaymentMethod	MonthlyCharges	TotalCharges	Churn
Electronic check	29.85	29.85	No
Mailed check	56.95	1889.50	No
Mailed check	53.85	108.15	Yes
Bank transfer (autom...	42.30	1840.75	No
Electronic check	70.70	151.65	Yes
Electronic check	99.65	820.50	Yes
Credit card (autom...	89.10	1949.40	No
Mailed check	29.75	301.90	No
Electronic check	104.80	3046.05	Yes
Bank transfer (autom...	56.15	3487.95	No
Mailed check	49.95	587.45	No
Credit card (automatic)	18.95	326.80	No

1 2 3 4 5 6 7 8 9 10 ... 307 Next Page

Rows 1-23 of 7043 total

© 2017-2019 H2O.ai. All rights reserved.

The Driverless AI Experience – Dataset from IBM

< H2O.ai Experiment **desusupe**

[DATASETS](#) [EXPERIMENTS](#) [MLI](#) [HELP](#) [PY_CLIENT](#) [MOJO2-RUNTIME](#) [MESSAGES\[0\]](#) [LOGOUT](#) [KSchlamb](#)

DRIVERLESS AI 1.3.0 – AI TO DO AI

Licensed to IBM (SN26193 – For evaluation only, not for production use)

TRAINING DATA

DATASET
creditcard.csv

ROWS
24K

COLUMNS
25

DROPPED COLS
--

VALIDATION DATASET
--

TEST DATASET
--

TARGET COLUMN
default payment next

FOLD COLUMN
--

Column to Predict

TYPE
bool

COUNT
23999

UNIQUE
2

TARGET FREQ
5369

ASSISTANT

TRAINING 4/4 ENSEMBLE BASE LEARNERS



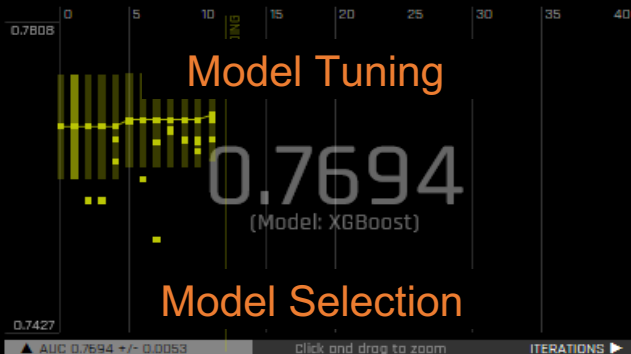
EXPERIMENT SETTINGS

EXPERT SETTINGS

SCORER



ITERATION DATA - VALIDATION

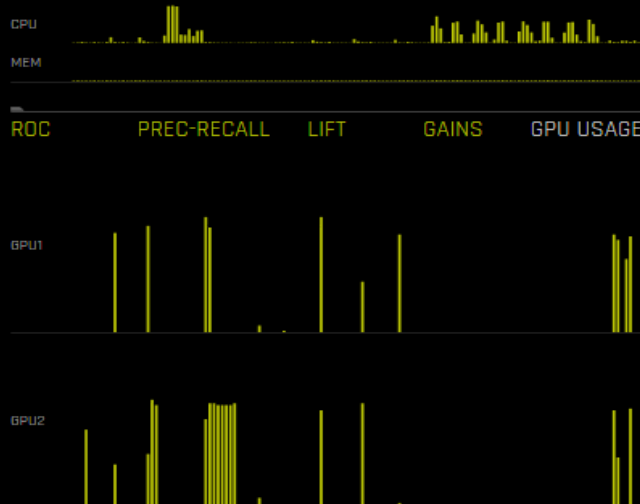


VARIABLE IMPORTANCE

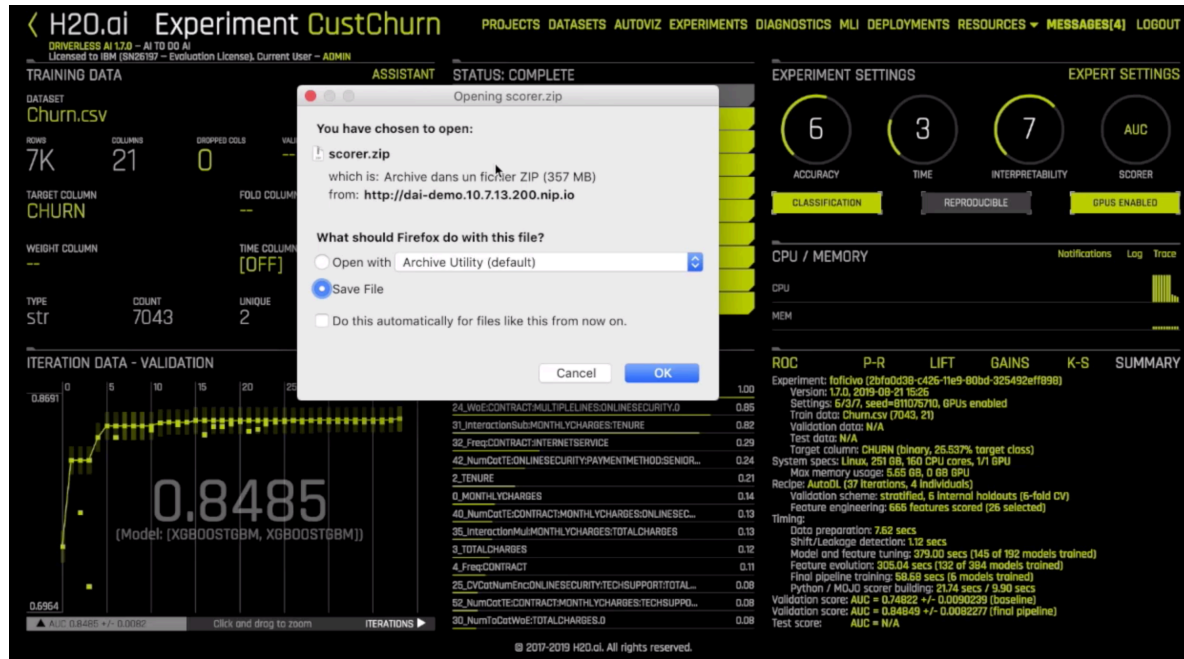
43_NumToCotTE:MARRIAGE:PAY_0:PAY_2.0	1.00
42_TruncSVD:MARRIAGE:PAY_0:PAY_2:PAY_3.0	0.71
47_TruncSVD:PAY_0:PAY_3:PAY_AMT5.1	0.57
48_NumToCotWoE:PAY_0:PAY_5:PAY_AMT2.0	0.35
10_PAY_0	0.30
27_ClusterDist6:PAY_0.5	0.16
27_C	0.15
32_I	0.13
50_NumToCotTE:PAY_2:PAY_5.0	0.11
59_NumToCotTE:LIMIT_BAL:PAY_4.0	0.10
57_ClusterTE:ClusterID6:BILL_AMT3:PAY_0.0	0.09
31_ClusterDist6:BILL_AMT1.4	0.08
63_NumToCotTE:BILL_AMT2:PAY_0:PAY_2:PAY_3:PAY_5:PA...	0.07
26_NumToCotWoE:LIMIT_BAL:PAY_4.0	0.07

Feature Engineering

Quickly Start Experiment



Export Scoring Pipeline



Scoring Pipeline export

Automatic Scoring Pipelines

Export ultra-low latency Python or Java Automatic Scoring Pipelines that include feature transformations and models.

Here, the Java/ Python Scoring Pipeline "scorer.zip" to be deployed on the inference system

Inference on the Edge , datacenter, Cloud ... on any device.

Export the Java/Python Scoring Pipeline (model) and run it on IBM i !

 YouTube

Client Scoring for evaluating the churn risk / probability base on historical data

Manually, with basic ML knowledge : 0.79%

Time to market : reduce it from months to days

Auto ML solutions with Hardware acceleration allow you to create high quality models, comparable to a ww ML grandmaster, very quickly , with only a good knowledge on ML.

With Driverless AI, The shaped model (Scoring Pipeline) can be executed on AIX or IBM i close to the core business applications and database.

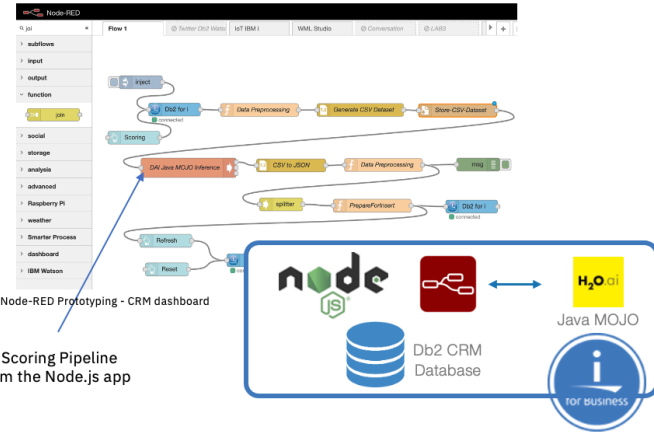


Fig. **Boosted CRM Application**
w/ integration of a real time scoring
Pipeline (Java MOJO)
ILE \leftrightarrow PASE Integration

Improving Profitability of Core Financial Services



H₂O.ai

- Data extracted from **IBM Db2 for i**
- Improved **years** of expert feature engineering
- **Increased accuracy** of existing credit risk scoring in **less time**
- **2x propensity to buy** for new bank products
- Accelerated by IBM Power Systems AC922

“By using Driverless AI on IBM Power Systems AC922, we have been able to build out ML/AI solutions in **less time**, with **improved quality** and **accuracy**.”

“We were also able to **double the propensity** for our banking customers **to accept an offer** of credit products, such as credit cards... We plan to use the platform for more use cases in the future.”

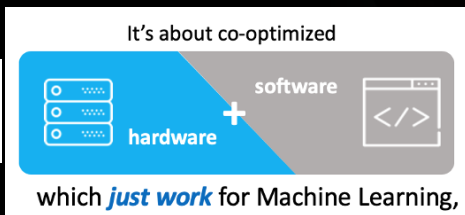
“This awesome result is because Driverless AI uses **the expertise of “Kaggle Grand Masters in a Box.”**”

[Vison Banco - IBM Customer Case Study](#)

Ruben Diaz
Data Scientist, Visión Banco

<https://www.linkedin.com/pulse/journey-towards-driverless-ai-ruben-diaz/>

How to get Started ?





How to get started?

[How to Start With Machine Learning on IBM i \(by Gan Zhang, IBM - Nov 2019\)](#)

Accessing the rest of your IBM i from Python (Kevin Adler)
[ibm_db driver presentation](#)

Join the #IBMiOSS LinkedIn [Group](#)

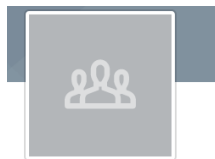
Check out the IBM i OSS Examples - Github [Repository](#)

YiPS <http://yips.idevcloud.com/wiki/>

[Bitbucket IBM i Open Source](#)

[My blog ☺](#) (K8s , App modernization , ML , H2O, Watson, Node-RED, IBM i)

Videos 2020 (AIX/IBM i in IBM Cloud , Terraform) [My Youtube Channel](#)



IBMiOSS

 Listed group



How to get started?



Data Analysis with Python



Data Visualization with R



Data Visualization using Python



<https://cognitiveclass.ai/courses/data-analysis-python>

<https://www.coursera.org/specializations/data-science-python>

How to get started? Demos

→ 'Scikit-learn on IBM i' Demonstration on Youtube

https://youtu.be/Uw_ePb8Hz3o?t=1296



→ Do it Yourself: Install yum packages and git clone

- <https://github.com/bmarolleau/firstdemo-scikitlearn-ibmi/>
- **Free Auto-ML ?** [Auto-sklearn](#) from Scikit-learn
- Need support or a live demo ? **Contact me!**



→ IBM i & AutoML: H2O Driverless AI

<https://www.youtube.com/watch?v=QemqAzpyJPc&feature=youtu.be>



common
EUROPE LUXEMBOURG

Modernisation des Applications IBM i & Open Source (webinaire)

Jeudi 25 mars – 14h00 – 17h00



Smarter IBM i Applications made easy with AI

Benoit MAROLLEAU – Cloud/AI Architect

IBM Garage for Systems - Montpellier, France

benoit.marolleau@fr.ibm.com



#IBMi #IBMiOSS Fan

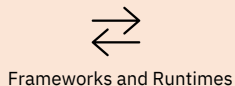
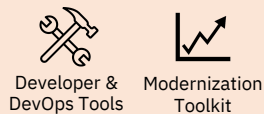


Cloud Paks – Pre-integrated for cloud use cases

Today, IBM offers clients *the first five Cloud Paks...*

**Reduce dev time
up to 84%***

Cloud Pak for Applications

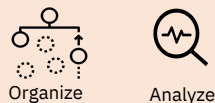


Container
platform and
operational services



**Make data ready
for AI in days**

Cloud Pak for Data

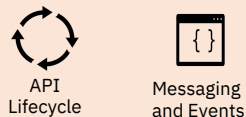


Container
platform and
operational services



**Eliminate 33%
of integration cost**

Cloud Pak for Integration

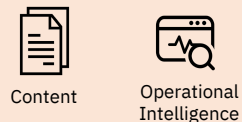


Container
platform and
operational services



**Reduce manual
processes up to 80%***

Cloud Pak for Automation

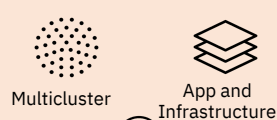


Container
platform and
operational services



**Reduce IT op expense
by up to 75%***

Cloud Pak for Multicloud Management

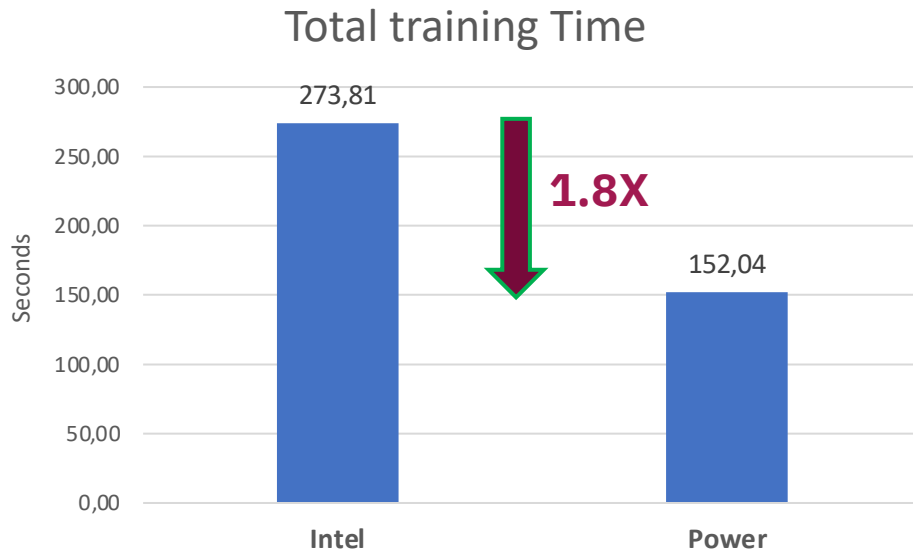


Container
platform and
operational services



LightGBM Algorithm is Faster on Power

H2O Driverless AI uses LightGBM as one of its main ML Algorithms



Advantages of LightGBM

1. Faster training speed and higher efficiency
2. Lower memory usage
3. Better accuracy than any other boosting algorithm
4. Compatibility with Large Datasets
5. Parallel learning supported.

LightGBM on Power (CUDA) is 1.8X faster than x86 (OpenCL)

Machine Learning

Use training data to derive $f(x)$ so that

Minimize (Actual - $f(x)$)

or mathematically

$$\min 1/n \sum_{i=1}^n (y_i - f(x_i))^2$$

	Feature	Feature	Feature	Feature	Label (=f(X))	
	Loan Requested	Income	Own House	Outstanding Debt	Decision	
Vector X Input	\$20,000	\$100,000	Y	0	Approve	Output
	\$50,000	\$70,000	N	\$20,000	Reject	
	\$5,000	\$150,000	Y	\$10,000	Approve	
	

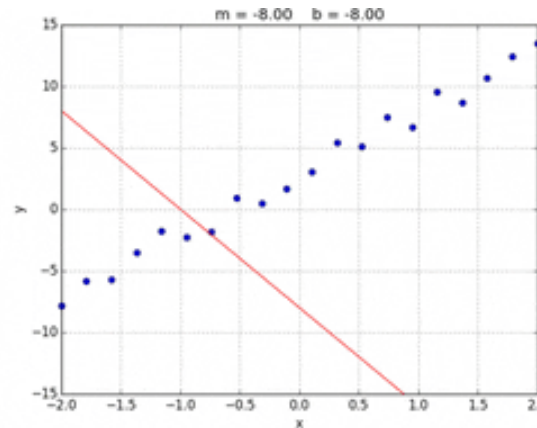
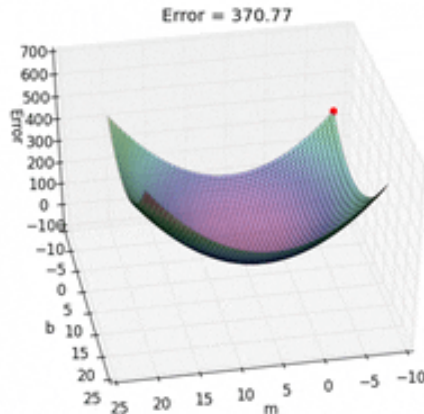
$$\begin{matrix} x_1 \\ x_2 \\ x_3 \\ \dots \\ x_n \end{matrix} \begin{bmatrix} x_{11} & x_{12} & x_{13} & x_{14} \\ x_{21} & x_{22} & x_{23} & x_{24} \\ x_{31} & x_{32} & x_{33} & x_{34} \\ \dots & \dots & \dots & \dots \\ x_{n1} & x_{n2} & x_{n3} & x_{n4} \end{bmatrix} \begin{bmatrix} y_1 \\ y_2 \\ y_3 \\ \dots \\ y_n \end{bmatrix}$$

- Learning phase : minimize the distance between the current result $f(x)$ and the actual result (supervised learning)
- Volume & Data quality are crucial (Training Dataset). Knowledge of the observed phenomenon, business.
- Each algorithm has **parameters** , adjusted (learned) according to the obtained errors during training.
- The choice of the algorithm is also key, as well as **hyperparameters** initialization.
- At the end of the training , the parameter values are fixed
- The execution of the validated, tested model on new examples is called **inference**
- Accelerators - GPU (or FPGA) – are useful in the Training Phase, sometimes in Inference : thousands of cores, good at matrix and vector calculation (tensors) can divide a training time by 50

→ **Solutions exist to assist in all these phases (Relax 😊)**

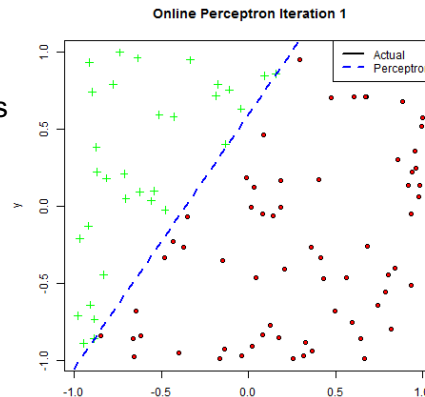
Machine Learning

Error Function
to minimize (almost)
at each iteration.



Regression

The model is getting better at each training iteration (while minimizing the error function)



Classification

→ Solutions exist to assist in all these phases (Relax 😊)

Machine Learning Solutions

On Premises ? Public Cloud ?

AI libraries & frameworks

- ML: scikit learn, R, Rstudio, SQL, H2O-3 , H2O Driverless AI ...
 - DL: PyTorch, TensorFlow, Caffe , Theano, Chainer ...
 - Distributed : Apache Spark, H2O Sparkling Water, HPC tooling...
 - Accelerated ML: Nvidia CUDA, Rapids , IBM Snap ML
- Hundreds to come every month...most of them are **free open source**



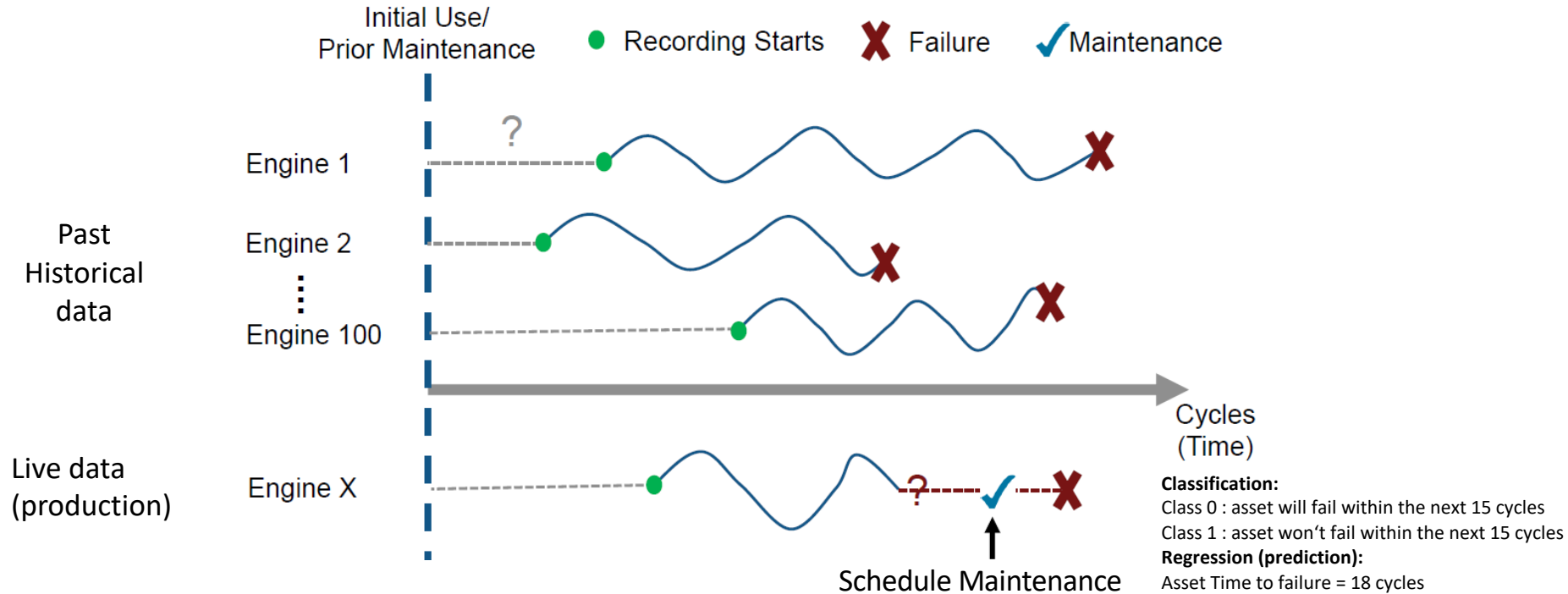
Desktop & Server Appliance with Accelerators (GPU)

Nvidia DGX , Intel ... GPU / FPGA based etc.

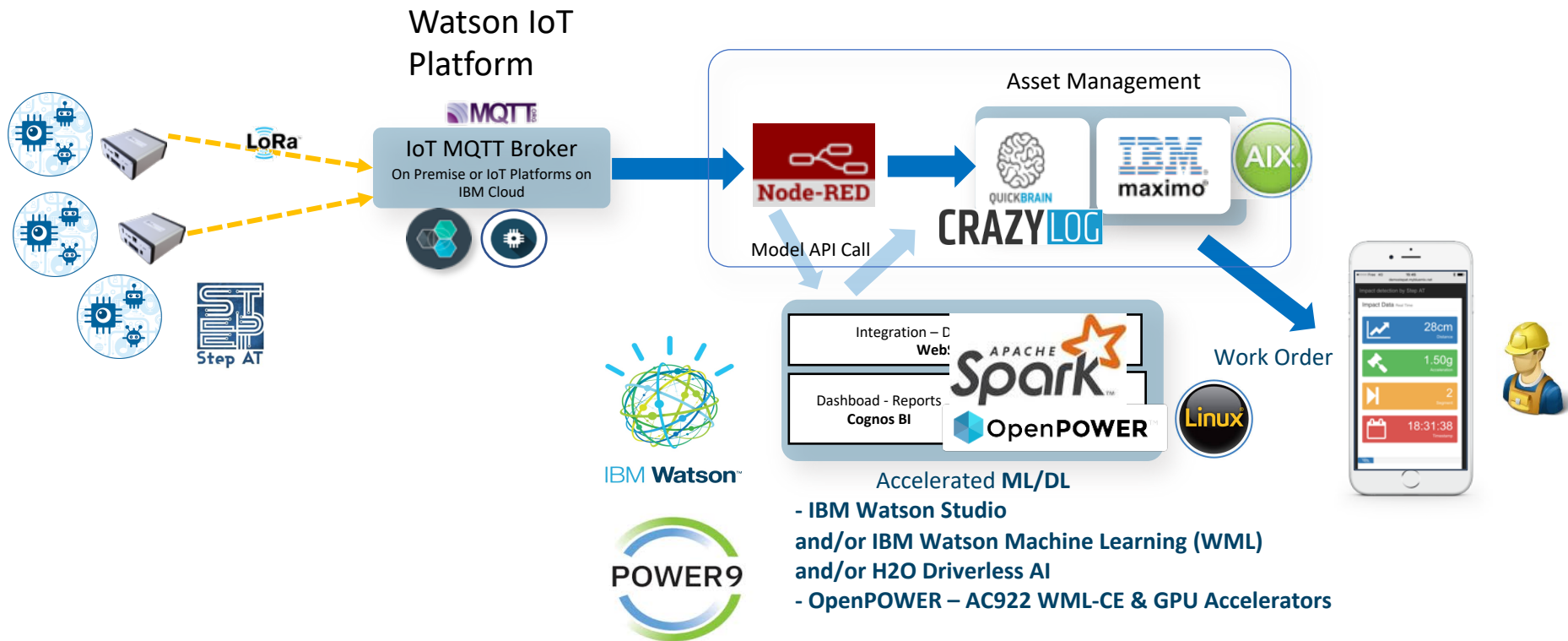
IBM AC922 : Oak Ridge 'Summit' SuperComputer Building Block



Example: Predictive Maintenance

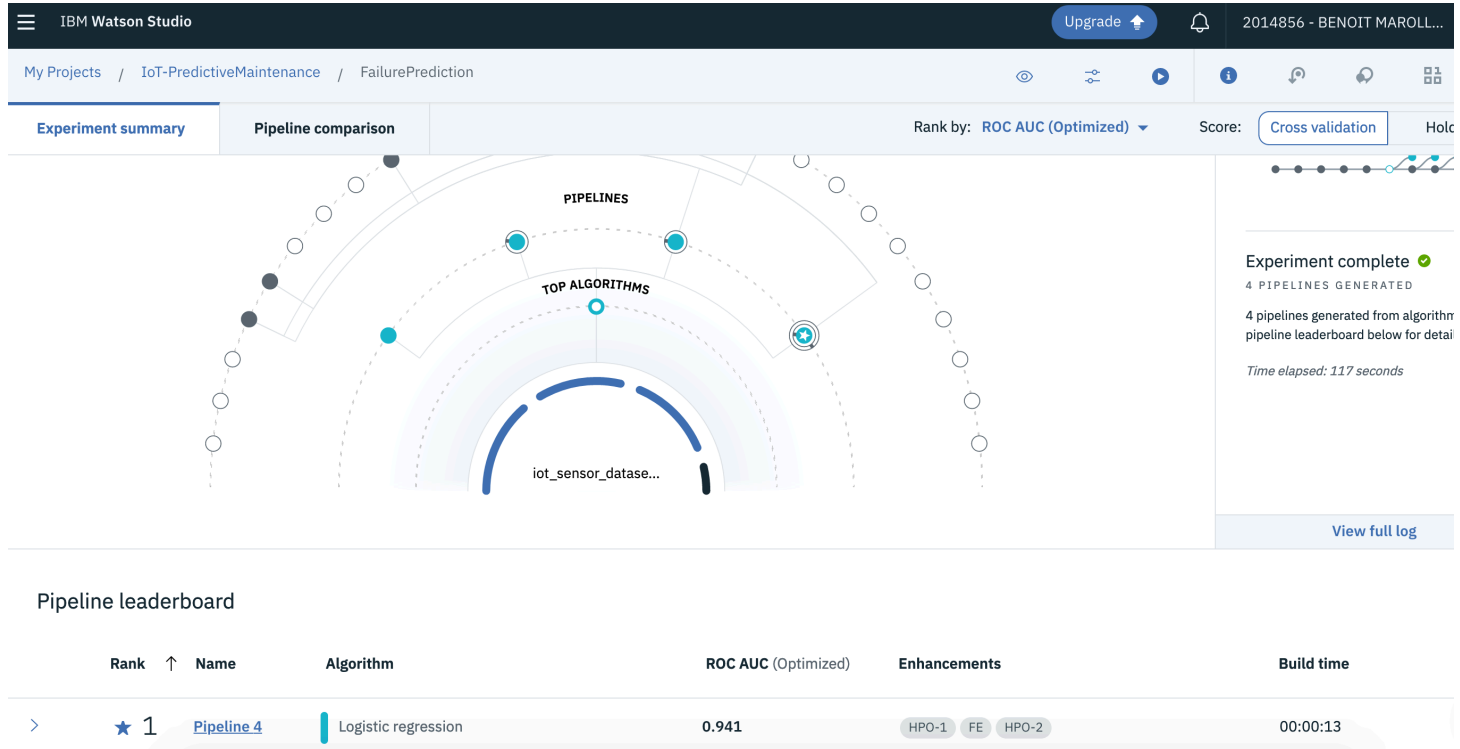


Example: Predictive Maintenance



Example: Predictive Maintenance

with Watson Studio



Model created with AutoAI on Studio. Can be deployed on WML (REST API...)

Computer Vision with IBM Visual Insights & IBM i

The screenshot displays the IBM PowerAI Vision interface, specifically the 'Data Sets' section. The top navigation bar includes 'IBM PowerAI Vision', 'Data Sets', 'Models', 'Custom Models', and 'Deployed Models'. On the left sidebar, under 'Filter by', 'Images' and 'Videos' are both checked. Below this, 'Categories' and 'Objects' are listed with 'Edit' links. The main content area is titled 'Data set / augmented' and shows 'Total files: 528', 'Matching files: 528', and 'Selected files: 1'. A row of buttons includes 'Train model', 'Augment data', 'Auto label', and 'Export data set'. Below this, another row of buttons includes 'Assign category', 'Label objects', 'Select', 'Delete', and 'Refresh'. The central area features a 'Drop files here' section with a download icon and an 'Import files' button. To the right, a grid of image thumbnails is shown, each labeled 'head' with a checkbox. The first thumbnail in the top row has a green checkmark and a play button, indicating it is the selected file. The bottom row of thumbnails shows various frames from a video, with the first frame labeled '527 frames'.

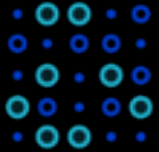
• IBM POWER SYSTEMS

AC922



An Acceleration Superhighway

Unleash state of the art IO and accelerated computing potential in the post “CPU-only” era



Designed for the AI Era

Architected for the modern analytics and AI workloads that fuel insights



Delivering Enterprise-Class AI

Flatten the time to AI value curve by accelerating the journey to build, train, and infer deep neural networks

