

Private AI Architecture

PowerAI Portfolio and Strategic Directions

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[@MarolleauBenoit](https://twitter.com/MarolleauBenoit)

Agenda

What is AI ? Machine Learning ? Deep Learning?
AI = Cloud ?

IBM “One AI” & PowerAI Solutions

PowerAI (WML-CE) , PowerAI Enterprise (WML-A) & AC922 HW

Private AI Solutions Overview

PowerAI Vision & Intelligent Video Analytics

h2O.ai Driverless AI

Watson Studio & ICP for Data

Appendices/Bonus to go further:

AC922 details & pricing, PowerAI Public References

Demos & Illustrations:

AI with IBM Cloud Private w/ PowerAI, AI Vision, H2O.ai, Watson Studio (DSX) Local :

[H2O.ai Driverless AI quick demo](#) on ICP/POWER

[DSX & Predictive Maintenance Example](#)



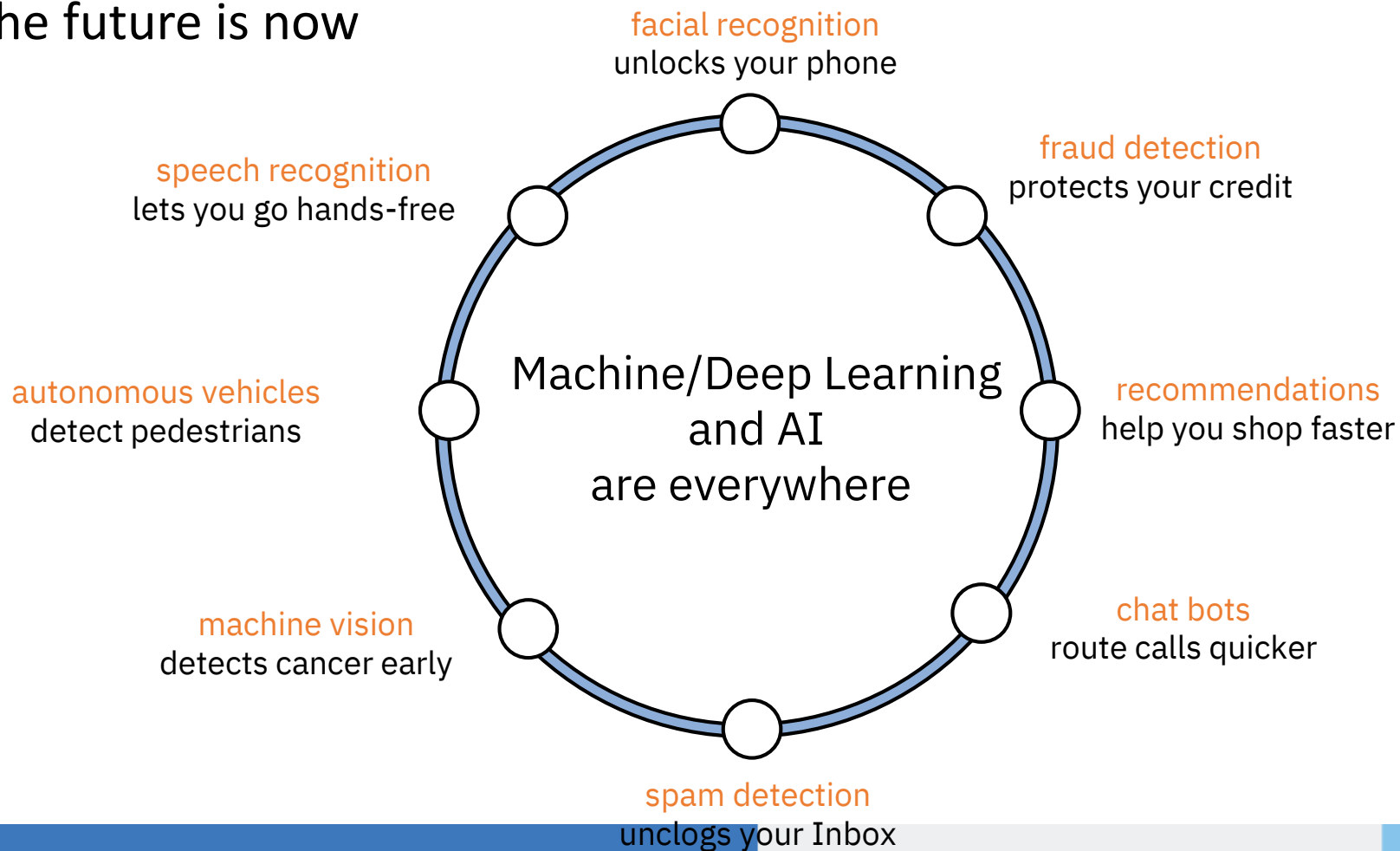
Machine learning is everywhere – influencing nearly everything we do

Netflix provides personalized movie recommendations



Waze provides a personalized driving experience for its users

The future is now



ML Use Cases?

Marketing: AI for Real Time Data

Retail Sales / Automotive: AI for Voice and Image Search coupled with AR/VR

Customer Support: AI for Natural Language (NLP)

Manufacturing: AI Powers Smart Robots (Vision) – Predictive Maintenance – Asset Inspection

Supply Chains: AI for Management – Predictive Maintenance

Information Technology Management: AI Helps Routing (Pattern)

Cybersecurity: AI Protects Assets

Financial Service: AI Enables Intelligent Processing

Life Sciences and Medicine: AI Leverages Algorithms (Vision, NLP)

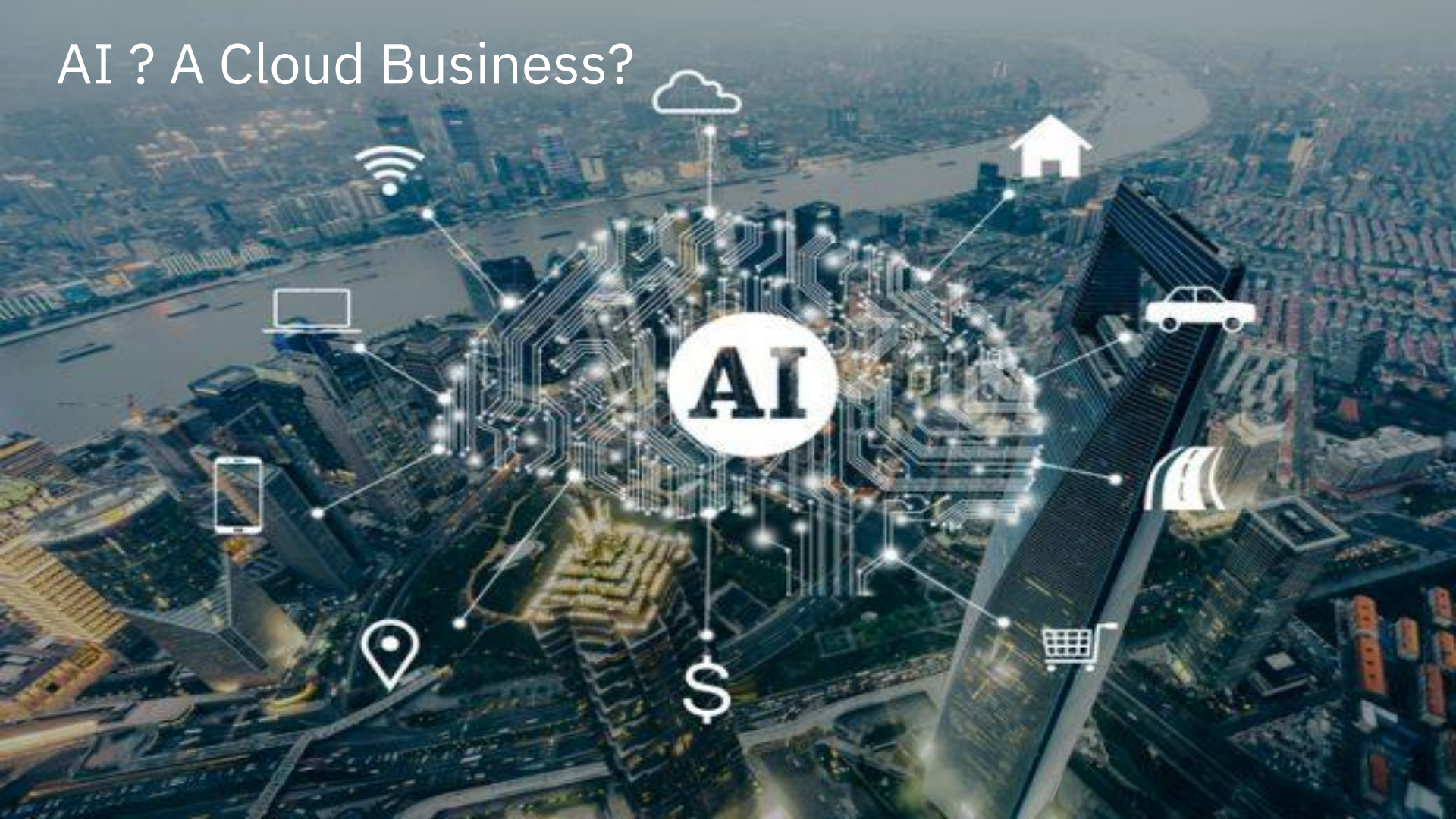
Smart Cities: AI Optimizes Myriad Functions (Cognitive IoT)

500+ POWERAI CLIENTS WITHIN ONE YEAR

40% NEW TO POWER



AI ? A Cloud Business?



AI, a Cloud Business? Yes but...

Set of Pre-trained Models

API Invocation

Ready to use

Majority of use cases

Additional Offerings to build new Models using State of the art Frameworks

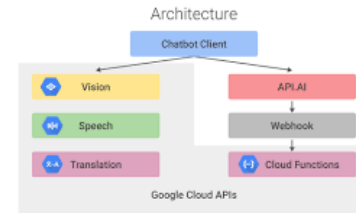
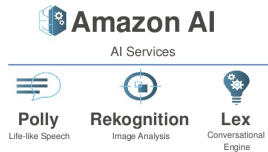
Limitations:

Data Gravity

Compliance & Regulations

...

=> AI will be **Public + Private** Cloud



50 underlying technologies

Entity Extraction

Sentiment Analysis

Emotion Analysis (Beta)

Keyword Extraction

Concept Tagging

Taxonomy Classification

Author Extraction

Language Detection

Text Extraction

Microformats Parsing

Feed Detection

Linked Data Support

Concept Expansion

Concept Insights

Dialog

Document Conversion

Language Translation

Natural Language Classifier

Personality insights



Big Data Sources



Business Data (Sensitive, Personal Data)

Enterprises Embracing Open-Source AI Software

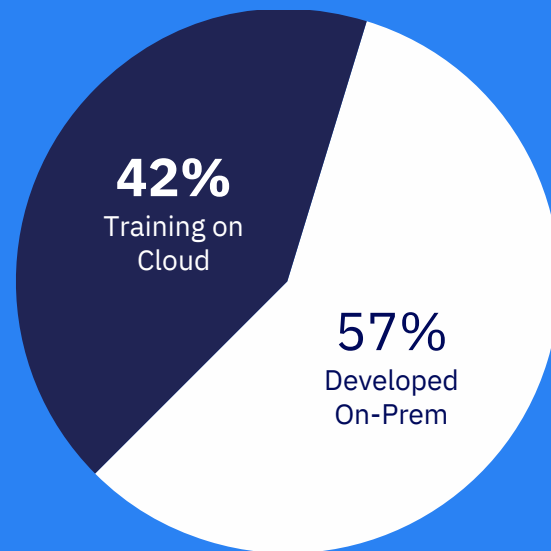
Enterprises building
Data Science teams

Most using Open-Source software:
TensorFlow is most popular

\$14B for AI Servers
+ ~\$50B for AI Software
(2021, IDC)

57%

AI Developed
On-Prem



Gartner

What is Machine Learning ? Deep Learning?

Deep Learning



What society thinks I do



What my friends think I do



What other computer scientists think I do



What mathematicians think I do



What I think I do

```
In [1]:  
  
import keras  
Using TensorFlow backend.
```

What I actually do

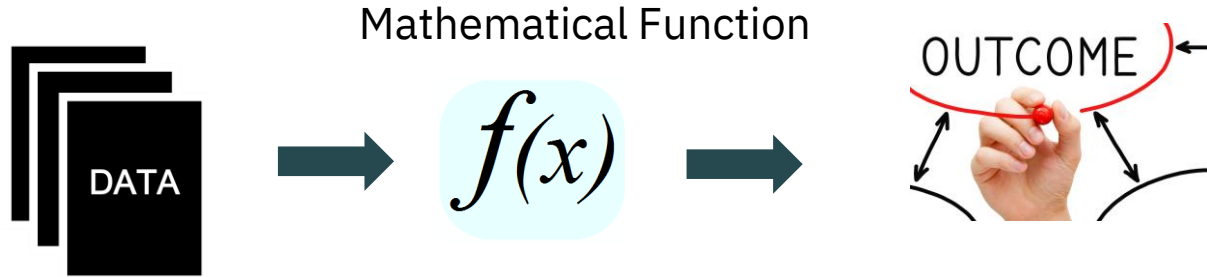
Decision Making



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

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

Machine Learning



- Credit card transaction
- Loan application
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- **Representing pattern by a mathematical function**
- **Machine learning is just a bunch of math**

Data – Estimate House Price

Sq Ft	Bedroom	Bathroom	Price
2000	3	2	\$350,000
1500	2	2	\$280,000
2200	3	3	\$400,000
...	...	...	...

- Every column except last is a feature
- Last column is a label
- This is a labeled data set

Data – Loan Application

Feature	Feature	Feature	Feature	Label
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
...	...	...	...	...

x_1	x_{11}	x_{12}	x_{13}	x_{14}	y_1
x_2	x_{21}	x_{22}	x_{23}	x_{24}	y_2
x_3	x_{31}	x_{32}	x_{33}	x_{34}	y_3
...	...	...	...	...	...
x_n	x_{n1}	x_{n2}	x_{n3}	x_{n4}	y_n

Machine Learning Objective

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

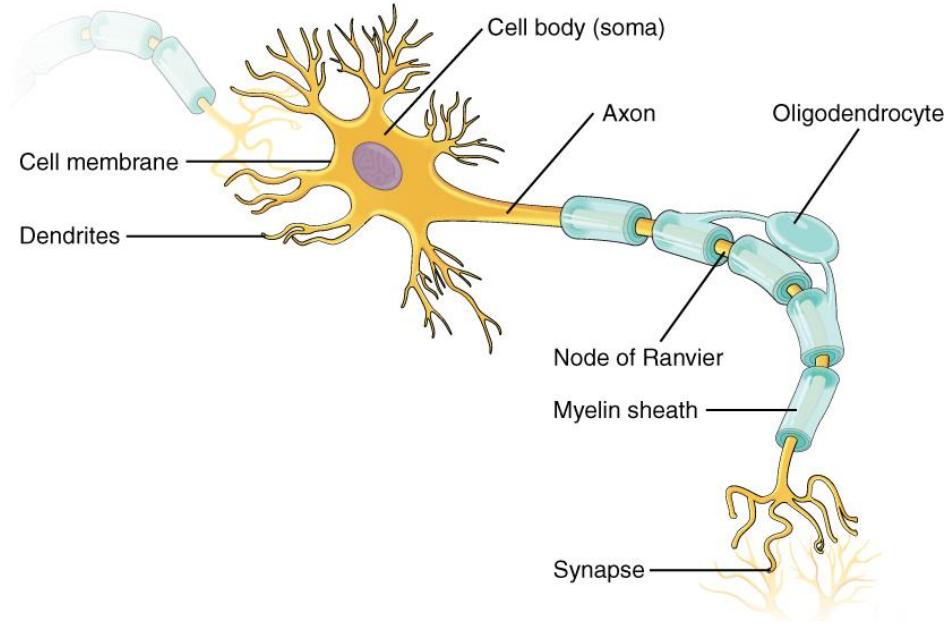
Minimize (Actual - $f(x)$)

or mathematically

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

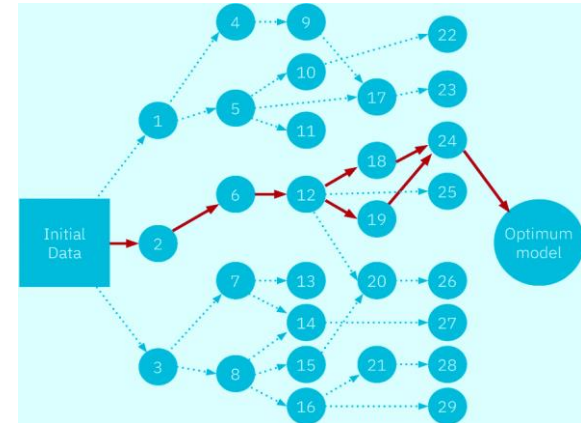
Deep Learning = Training Artificial Neural Networks

Based on biological neurons. Artificial neurons learn by recognizing patterns in data.



A human brain has:

- 200 billion neurons
 - 32 trillion connections between them
- Artificial neural networks have far fewer



Deep Learning = Training Artificial Neural Networks

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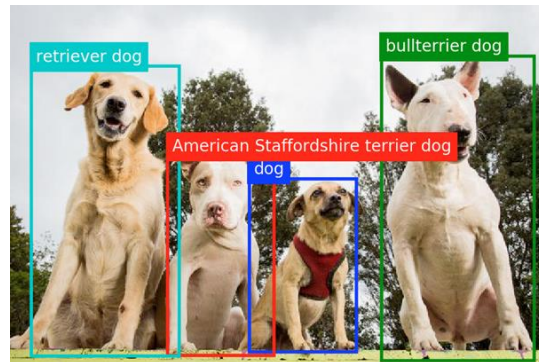
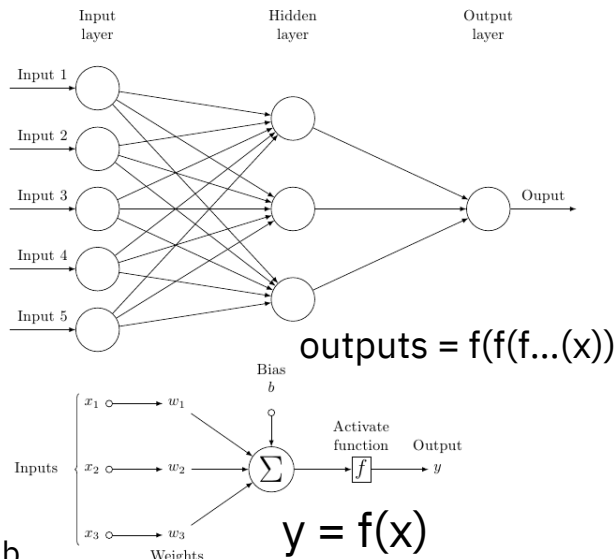


Each input value is a pixel
RGB Value (3 Channels)

Training = Adjust the parameters (w, b)
To get the best validation results
Vs. ground truth (Training set).

Inference = apply the model to the input (w, b
fixed) to get the output (classification, detection, ...)

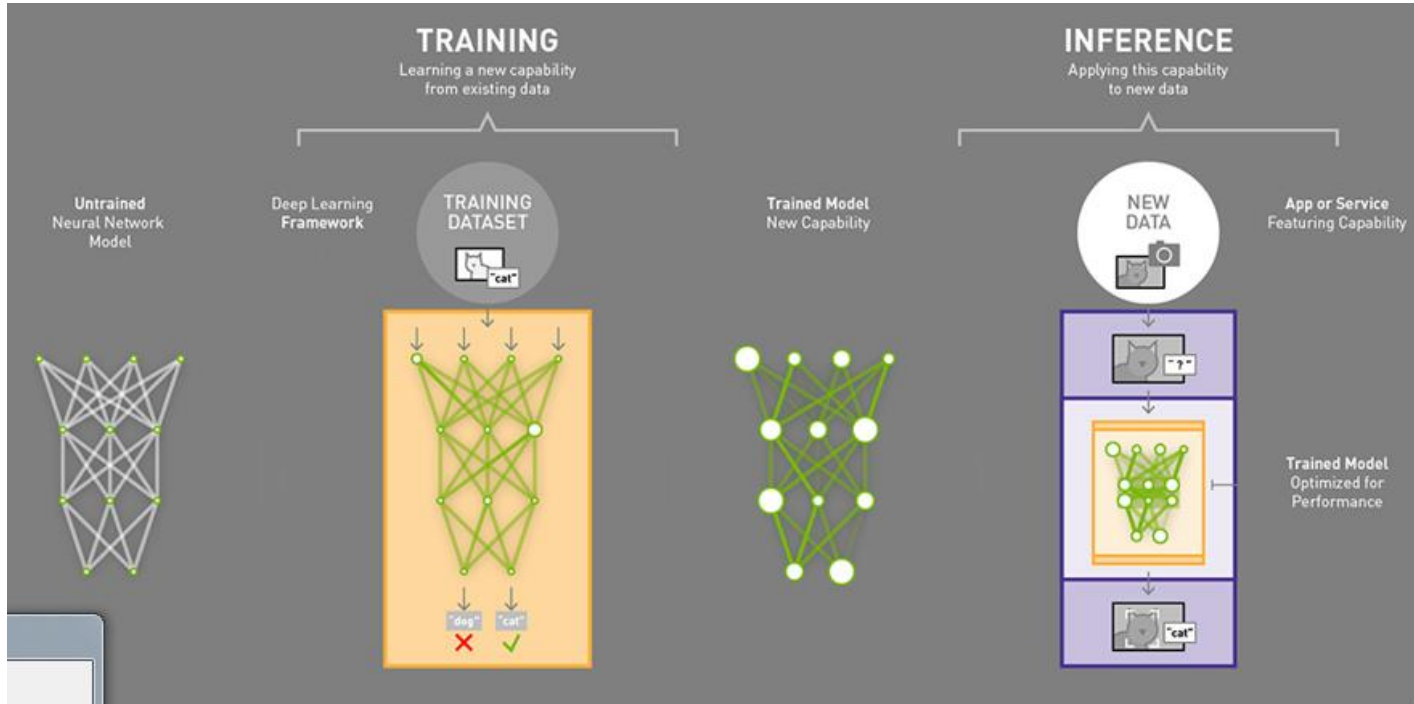
Neural net Framework & Python Programming



Each output contains:
detection_boxes
detection_scores
detection_classes
num_detections

Deep Learning = Training Artificial Neural Networks

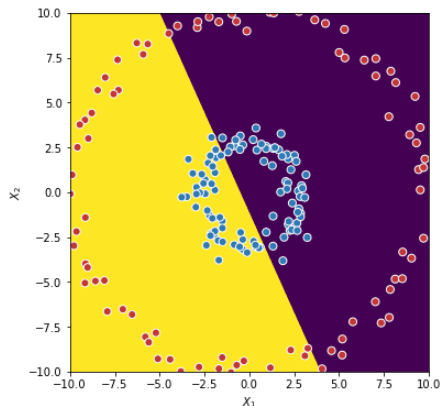
Based on biological neurons. Artificial neurons learn by recognizing patterns in data.



Deep Learning = Training Artificial Neural Networks

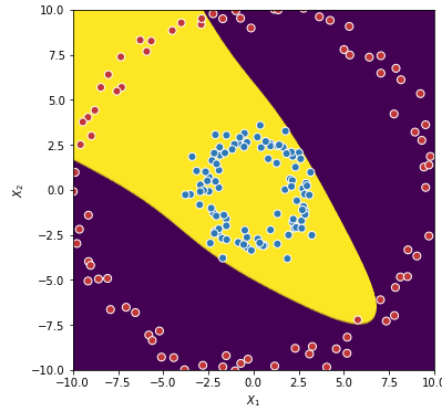
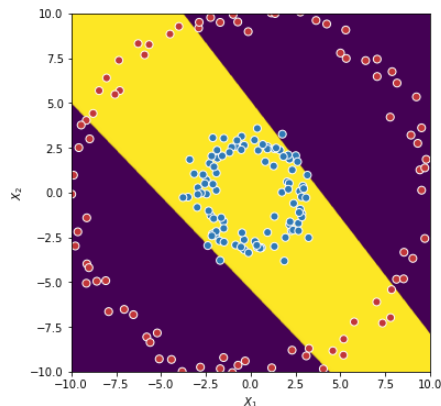
Example solving a non linear classification problem

boundary formation with 1 layer and non linear “relu” activation function

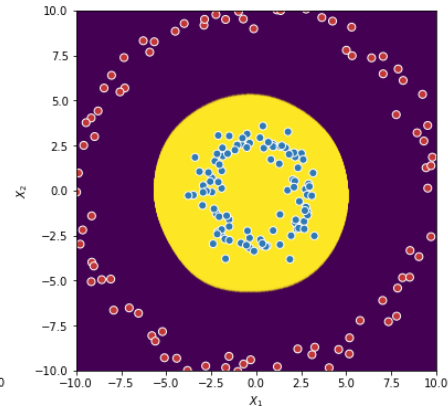


`mlp = MLPClassifier(hidden_layer_sizes=(1),
max_iter=500000,activation='identity',learning_rate_init=0.01)`

1 layer and 2 neurons



1 layer and 3 neurons

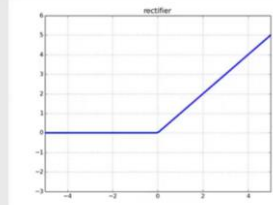


Decision plane with 30 neurons

Rectified Linear Unit (ReLU)

ReLU

$$f(x) = \begin{cases} 0 & \text{for } x < 0 \\ x & \text{for } x \geq 0 \end{cases}$$

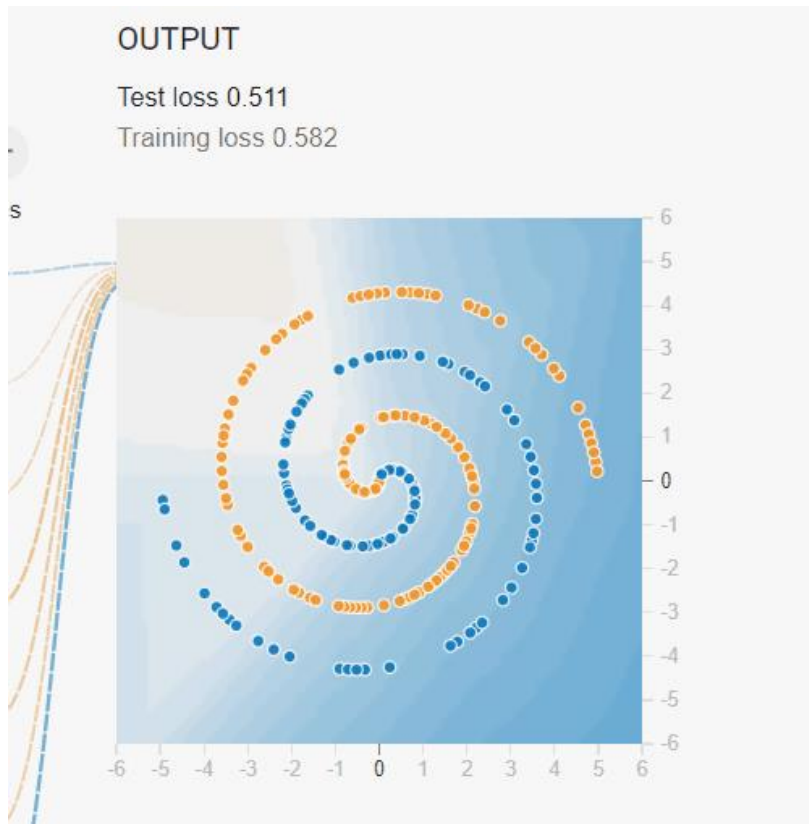


Neural Nets Simulator:
<http://playground.tensorflow.org>

Deep Learning = Training Artificial Neural Networks

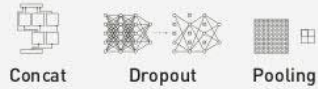
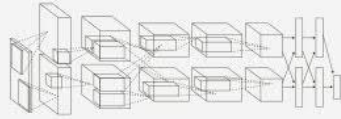
Example solving a non linear classification problem

boundary formation
with 3 layers and
'relu' activation

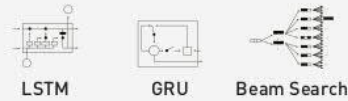
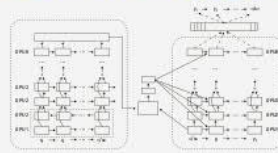


Neural Nets Simulator:
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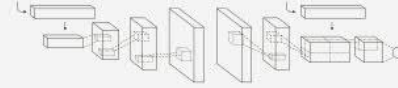
Convolution Networks



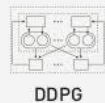
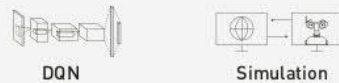
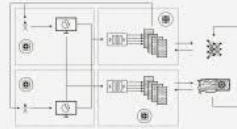
Recurrent Networks



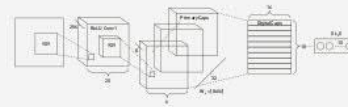
Generative Adversarial Networks



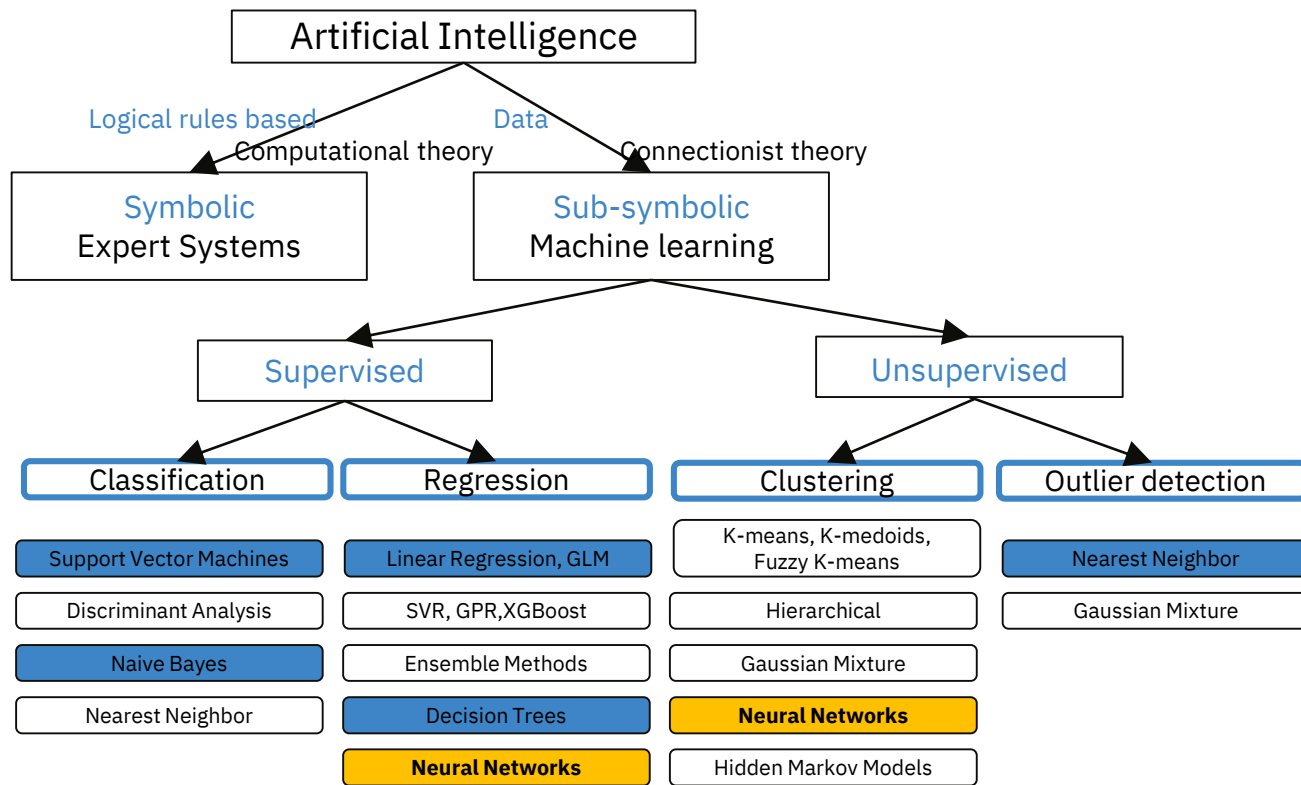
Reinforcement Learning



New Species



The Machine Learning Tasks & algorithms



Humans

2011



26% Errors

Machine Learning Based



5% Error

2016



3% Errors

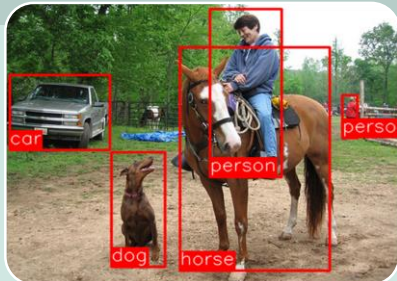
Deep Learning Based

CNN Models detect more and more details in images/videos



Classifier

- Dog: 98%
- Cat: 20%
- Ex : VGG, ResNet, GoogleNet, AlexNet
- ...



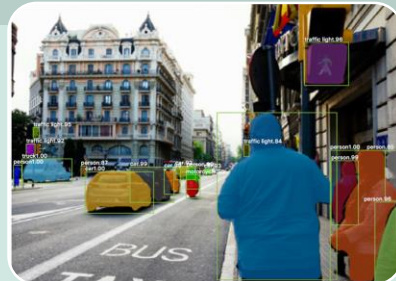
Object Detection

- Car 1 : 90%
{x1,y1,x2,y2}
- Dog 2 : 80%
{x3,y3,x4,y4}
- Person 1: 80%
{x1,y1,x2,y2}
- Person 2 : 70%
{x1,y1,x2,y2}
- Horse 1 : 70%



Semantic segmentation

- Category « car » :
pixel fields 1 90%
- Category « Road » :
pixel field 2 97%
- Category « person » :
...
- Ex : U-Net, PSPNet, DeepLab



Instance segmentation

- Instance Category
« car » 1 : pixel field
1 90%
- Instance Category
« car » 1 : pixel field
1 90%
- ...
- Ex : Mask-RCNN

Pain Points – Deep Learning Pipeline

Made with PowerAI Vision – Sport / Advertising

DATA PREPARATION

Complexity
/
Technology
Rapidly
Changing

Volume,
Multi-
Source
Labeling &
Tagging,
Ingestion

Hyper-parameter
Complexity,
Massive Compute
Intensive
Iterations, Long
Training Times,
Limited Resources

DEPLOY & INFER

Model
Tuning/
Pruning,
Scale &
Performance
, Resiliency,
Application
Access

Data
Changes,
Constant
Iteration
Required

UP & RUNNING

BUILD, TRAIN,
OPTIMIZE

MAINTAIN
ACCURACY

Sharing Valuable Resources Across Multiple Users, Multiple Lines of Business, Multiple Applications
With Security, Resiliency, and at Scale

IBM & AI

Introducing AI On Premises & Private AI

IBM PowerAI

IBM PowerAI



OpenPower Foundation – After 6 years of existence...

- Drivers: Innovation vs. Moore law
- Collaborative Approach
- Domains:
 - Cloud & Scale Out Architecture
 - Research/ High Perf Computing
 - Analytics, Big Data
 - Machine Learning / Deep Learning
- IBM Sells OpenPower servers
 - Power Systems POWER9...



<https://www.ibm.com/cloud/bare-metal-servers/power>
<https://console.bluemix.net/docs/services/PowerAI-IBM/>

OpenPower Summit 2018

330+ Members	Active Membership From All Layers of the Stack	100k+ 2300 ISVs	Linux Applications Running on Power Written Code on Linux
33 Countries	Partners Bring Systems to Market	169 20+ 50+ 100+	OpenPOWER Ready Certified Products (Nearly tripled since inauguration at 2016 Summit) Systems Manufacturers POWER-based systems shipping or in development Collaborative innovations under way
70+ ISVs			

Source [Forbes](#)



Patrick Moorhead

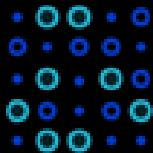
Google announced it has deployed POWER-based systems into its data center

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



Seamless CPU and Accelerator Interaction

coherent memory sharing
enhanced virtual address translation



Broader Application of Heterogeneous Compute

designed for efficient programming models
accelerate complex AI & analytic apps

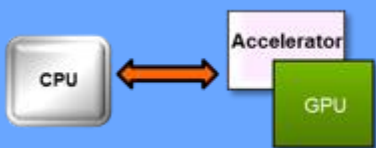
“vanilla”

Others



extreme CPU and Accelerator bandwidth

2x



PCIe Gen4

5x



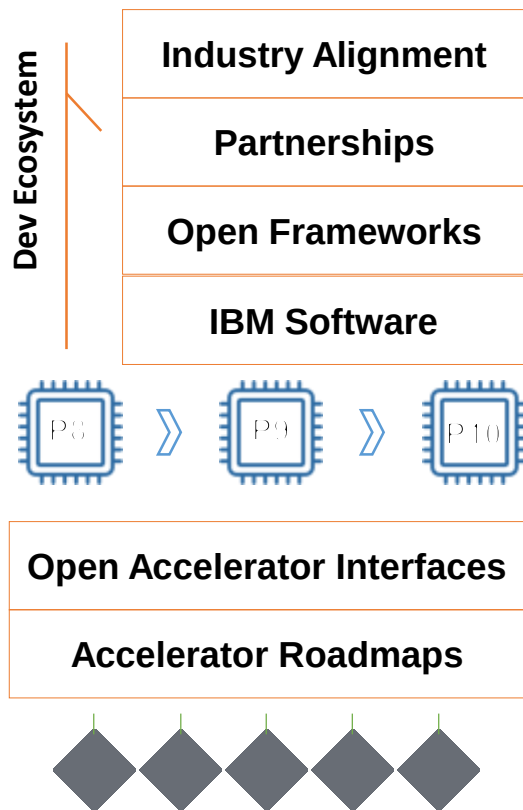
POWER8
with NVLink 1.0

7-10x



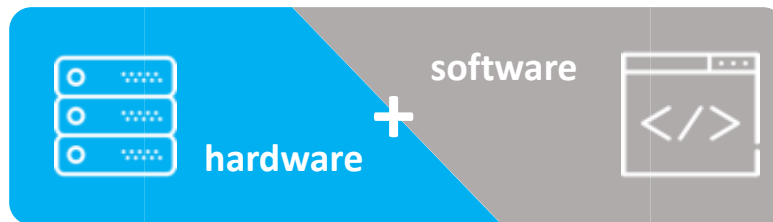
POWER9 with 25G Link
+ NVLink 2.0

Cognitive Systems are built with optimized HW & SW



Not Just About Hardware Design

It's about co-optimized



which ***just work*** for Machine Learning,
Deep Learning and AI

POWER9 is the **only** processor with NVLink 2.0 from CPU to GPU
Delivering **5.6X Host-Device bandwidth vs Xeon E5-2640 v4**
based systems with CUDA H2D Bandwidth Test
No code changes are required to leverage NVLink capability

“We’re excited to see accelerating progress as the [Oak Ridge National Laboratory Summit supercomputer](#) machine, which we expect will be among the world’s fastest supercomputers. The advanced capabilities of the IBM POWER9 CPUs coupled with the NVIDIA Volta GPUs will significantly advance DOE’s mission critical applications,” says Buddy Bland, Oak Ridge Leadership Computing Facility Director

(Free) PowerAI 1.6 Overview (WML-CE)

Linux Native install or docker image on RHEL 7.6 / Ubuntu 18.04

<https://hub.docker.com/r/ibmcom/powerai/>

Works with CUDA 10 + Nvidia drivers

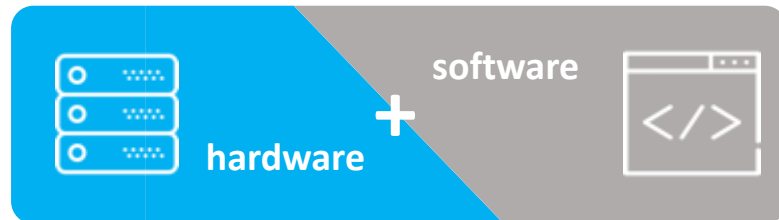
- Distributed Deep Learning (DDL) 1.3.0
- TensorFlow 1.13.1
- IBM Caffe 1.0.0
- Caffe2 1.0.1
- PyTorch 1.0.1
- Snap ML 1.2.0
- Rapids cuDF /cuML 0.2.0

Available on x86-64 architecture, Optimized for

- IBM AC922 POWER9 system with NVIDIA Tesla V100 GPUs
- IBM S822LC POWER8 system with NVIDIA Tesla P100 GPUs

Not Just About Hardware Design

It's about co-optimized



PowerAI
Vision

Auto-ML for Images & Video

Label

Train

Deploy

PowerAI
(WML-CE)

PowerAI: Open Source Frameworks

 TensorFlow™  PYTORCH  Chainer  SnapML

Large Model Support (LMS)

PowerAI
Enterprise
(WML-A)

Distributed Deep
Learning (DDL)

Auto ML (future)

IBM Spectrum Conductor

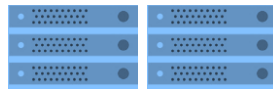
Cluster Virtualization, Elastic Training
Auto Hyper-Parameter Optimization

Deep Learning Impact (DLI) Module

Data & Model
Management, ETL,
Visualize, Advise

Evolving
with IBM
One AI
Strategy

Accelerated
Infrastructure



Accelerated Servers
AC922



Storage (Spectrum
Scale ESS)

PowerAI Top 4 Features

Snap ML & H2O

2x to 40x Faster Machine Learning with Snap ML. H2O Driverless AI automates ML. Most enterprise clients use ML today

Large Model Support (LMS)

Our TensorFlow can handle larger models & datasets; leads to higher accuracy

PowerAI Vision

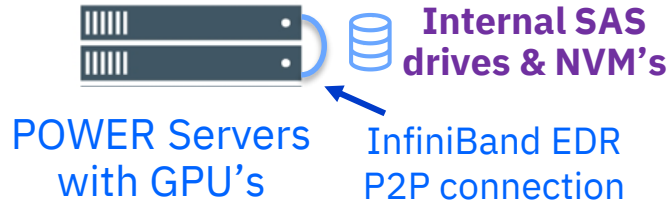
Enables clients without data scientists to start with AI. Bundle with lab services or service provider or workshop

WML Accelerator

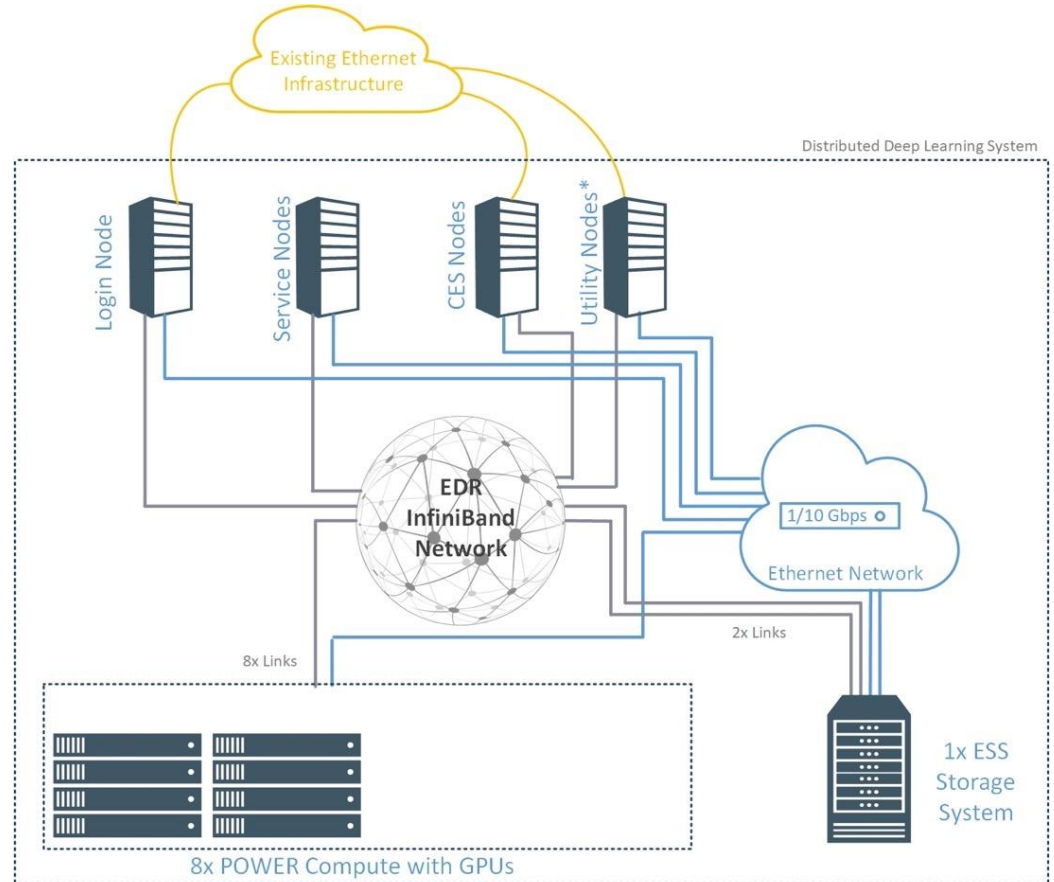
Higher Server & GPU Utilization. Target x86 server install base. We can schedule & manage GPU resources better than other software

Hardware Overview

Starter Deep Learning System



Mid-Size Deep Learning System



Reference Architecture for AI Infrastructure

Experimentation Single Tenant

```
1 # Import necessary modules
2 import tensorflow as tf
3 import logging
4
5 from tensorflow.keras import layers
6 from tensorflow.keras import models
7 from tensorflow.keras import optimizers
8 from tensorflow.keras import callbacks
9 from tensorflow.keras import metrics
10 from tensorflow.keras import utils
11 from tensorflow.keras import backend as K
12 from tensorflow.keras import regularizers
13 from tensorflow.keras import constraints
14 from tensorflow.keras import initializers
15 from tensorflow.keras import activations
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```

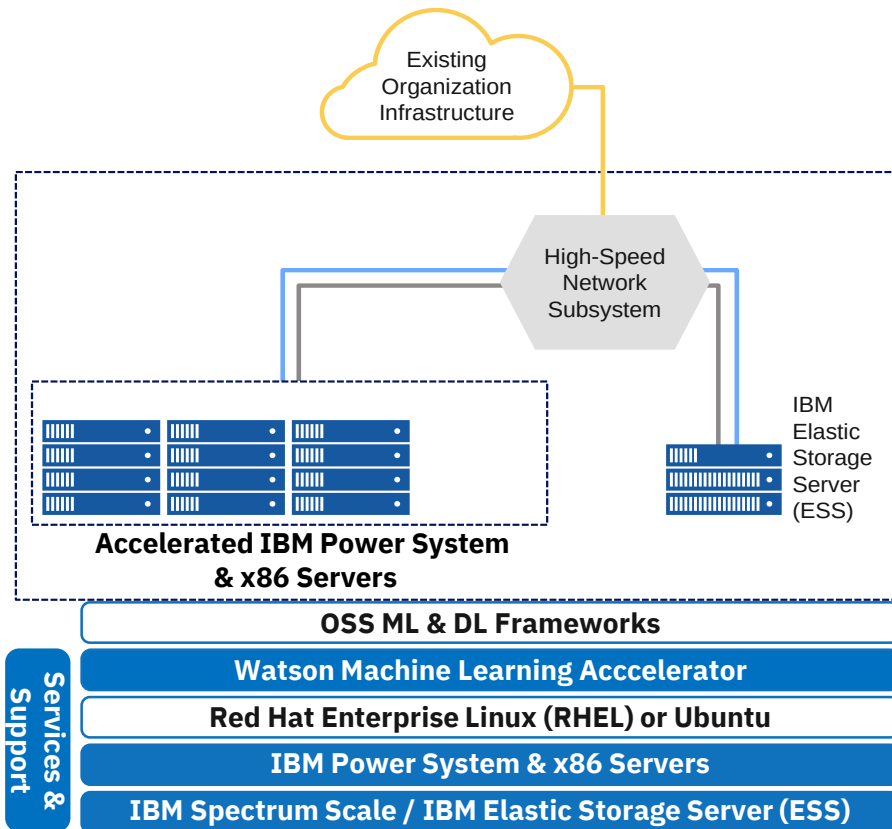
PowerAI

Cuda Drivers – OSS Frameworks

Red Hat Enterprise Linux (RHEL) or Ubuntu



Production – Multi Tenant & Scalability



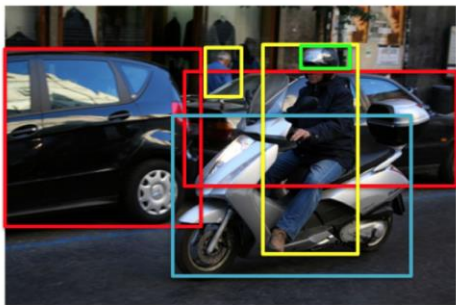
		Deep Learning			ML and DL	Machine Learning
		Power AI Base (WML-CE)	Power AI Enterprise (WML-A)	AI Vision	Watson Studio Local	H2O Driverless AI
Offering	Description	Deep Learning	Deep Learning for the Enterprise	Deep Learning with Video tools	Notebook oriented development environment for ML and DL	Automated Machine learning
	Pricing Model	Free download	Commercial	Commercial	Commercial	Commercial
	Support	Available from IBM	IBM L 1-3 Included	IBM L1-3 Included	Available from IBM	H2O L 1-3
Applications	Text & Numeric	Yes	Yes	No	Yes	Yes
	Images	Yes	Yes	Yes	Yes	No
	Video	-	Optional add-on	Yes		No
	Primary Persona	Data Scientist	Data Scientist	Line of Business	Data Scientist	Data Scientist
	Second persona	IT	IT	IT	IT	Line of Business
	User Skill Level	High	Medium to high	Low	Medium to high	Low to Medium
Strengths		Rapid deployment, high performance, scale	enterprise grade, High performance, rapid Deployment	Rapid deployment, simple GUI high performance	Notebook based development environment, strong collaboration, model management	Simplified deployment, intuitive user interface, automatic pipelines, "explainability" for models, end to end automation
Platform	Distributed DL (DDL)	1-4 nodes	1-thousands of nodes	Coming	Coming	-
	Large Model Support	Yes	Yes	Coming	Coming	-
	Server(s)	S822LC or AC922	S822LC or AC922	S822LC or AC922	S822LC or AC922, LC922	S822LC, AC922, LC921/922
IBM Products	Spectrum MPI (DDL)	Limited to 4 nodes	Included			Optional add-on
	Spectrum Conductor DLI	Optional add-on	Included	Coming	Optional Add On	Optional add-on
	IBM Watson Studio Local	Optional add-on	Optional add-on	No		Optional add-on
Cloud	IBM Cloud Public	Yes	No	Trial only	Watson Studio	?
	IBM Cloud Private	Yes	Yes	Yes	Yes	Yes



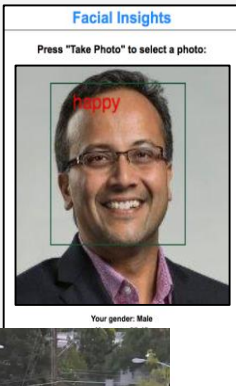
H2O Driverless AI Complements IBM PowerAI Vision



IBM Power AI delivers
Deep Learning for Images



Person
Car
Motorcycle
Helmet



H2O Driverless AI is an
Automatic Machine Learning

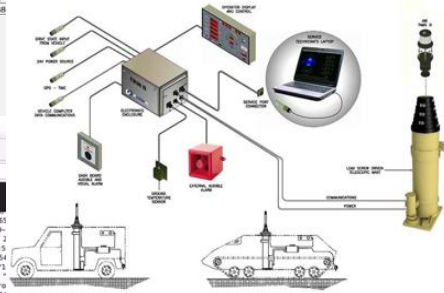
Transactional Data: Store Level

Transactional

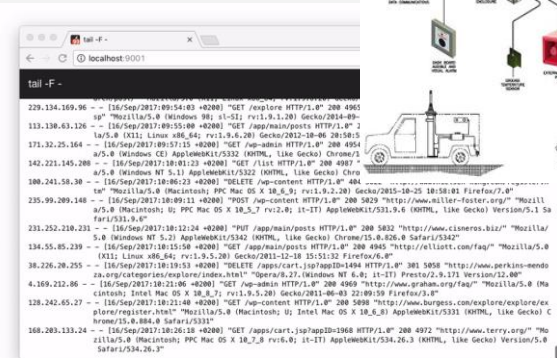
Transaction ID	Date	Time	AMOUNT	Card_number
p3513045367	11/24/2010	3:20:32 AM	14.47526	*****2323
q6781991970	12/4/2010	10:30:10 AM	39.46618	*****6451
v1178278252	11/2/2010	1:25:21 AM	24.99964	*****2179
v7329082178	10/8/2010	12:29:40 AM	19.21824	*****5826
h8835491892	10/17/2010	10:36:12 PM	39.56086	*****9498
u833871154	12/5/2010	8:22:59 PM	33.35402	*****9379
v1240343519	10/27/2010	4:12:35 AM	49.64481	*****5466
w5440173613	11/26/2010	10:36:36 PM	24.23247	*****1816
u8906115216	11/1/2010	1:57:33 PM	32.45102	*****2642
v1400444560	11/25/2010	7:26:45 PM	32.12291	*****4330
v3667560889	10/9/2010	11:09:58 AM	21.93351	*****6533
p6738276686	11/24/2010	10:14:36 AM	21.71996	*****4615
q8964299413	11/24/2010	1:19:24 AM	15.46741	*****7694
r9012945206	11/22/2010	2:02:18 PM	31.14302	*****7180
s2136305133	11/23/2010	7:15:13 PM	43.16047	*****9208
t7478724264	11/2/2010	12:08:46 PM	40.14018	*****2695
u8944402319	10/31/2010	3:10:19 AM	23.70907	*****2980
v2388798972				
w567236458				

Example: Flat File

Sensors



Log



Kubernetes/IBM Private Cloud w/ PowerAI : Build your own AI Private Cloud

User1 – Web Browser

PowerAI Vision



IBM Data Science Experience

H₂O.ai

User2

IBM PowerAI

User3 – Web Browser

IBM PowerAI



Watson Studio



IBM Watson



IBM Cloud

IBM Cloud Private

Catalogue



with GPU

GPU as a Service
On demand

GPU as a Service
Dedicated

PowerAI Vision

Kubernetes

Worker Node: Power AI

Deep Learning Framework

Supporting Libraries

GPU

GPU

GPU

GPU

Worker Node: Power AI

Deep Learning Framework

Supporting Libraries

GPU

GPU

GPU

GPU

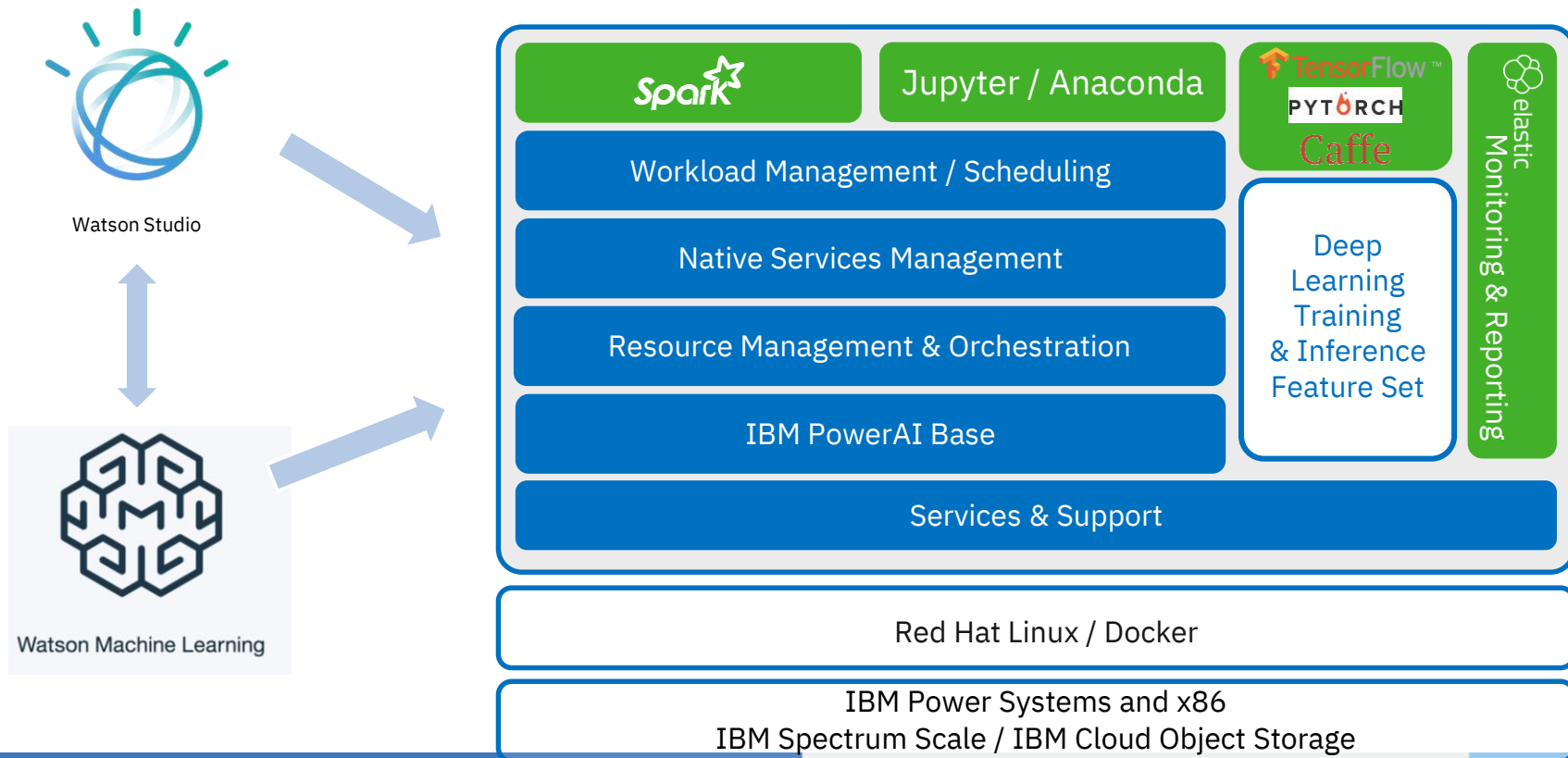
X86 and VMWare

Master Node

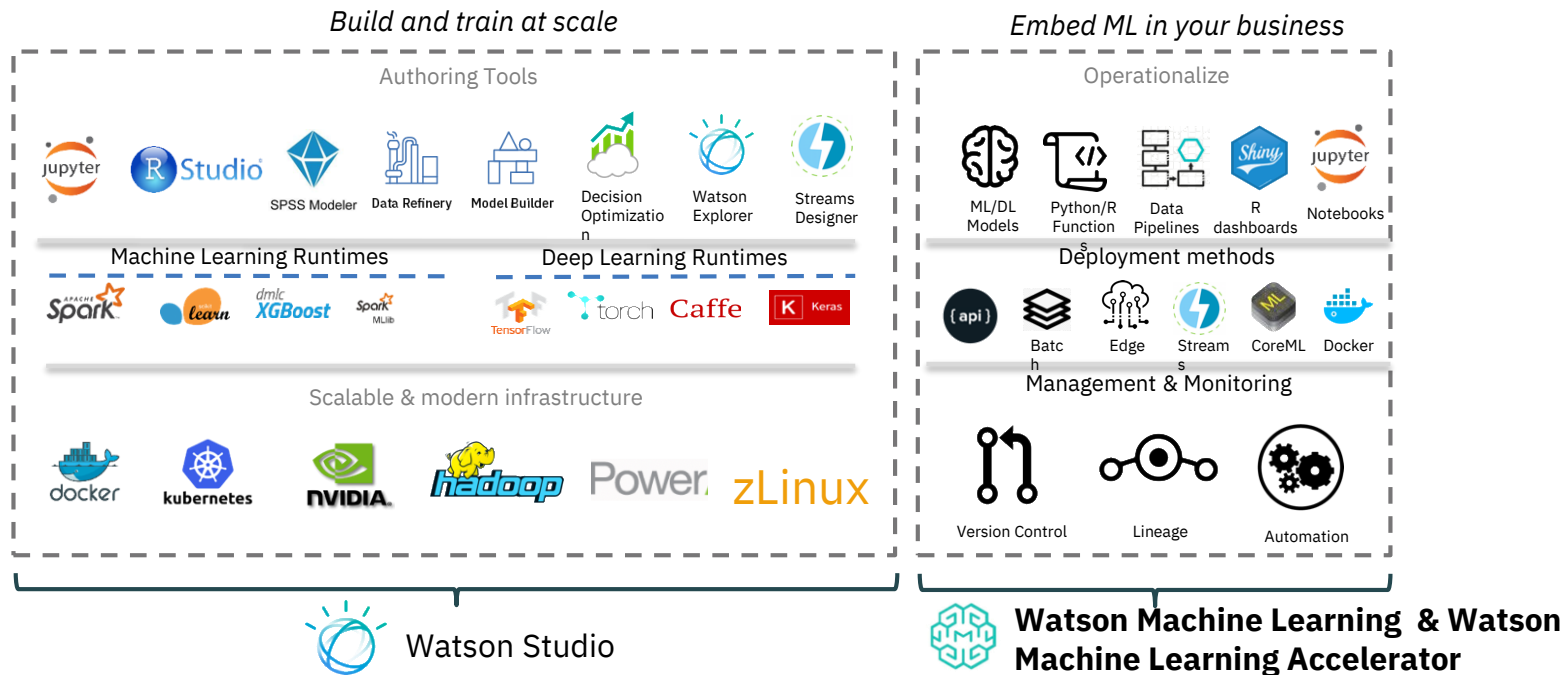
Worker Node

IBM Watson ML Accelerator:

Power AI Base + Spectrum Conductor + Deep Learning Impact



Injecting AI Firepower with IBM Watson Studio and IBM Watson Machine Learning



Mix and Match your deployment

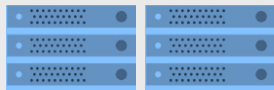
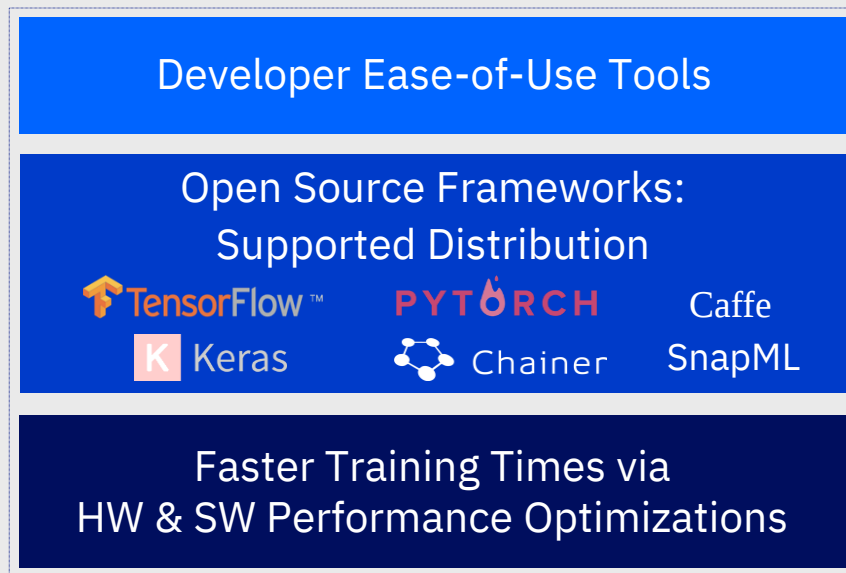
- ✓ IBM Cloud
- ✓ Public Cloud – AWS, Azure
- ✓ On Premises / Private Clouds
- ✓ Desktop

- Focus on PowerAI differentiators
 - PowerAI Base WML-CE: LMS, Accelerated ML, Solutions*
 - PowerAI Enterprise WML-A : Scalability*

PowerAI

Open-Source Based
Enterprise AI Platform

Integrated & Supported AI Platform
3-4x Speedup for AI Training
Ease of Use Tools for Data Scientists



GPU-Accelerated
Power Servers



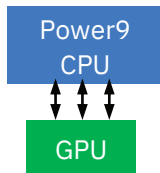
Storage

PowerAI: Enterprise AI Platform

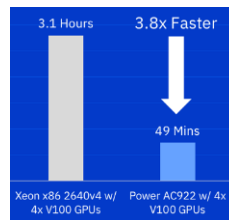
Simplicity: Integrated Platform that Just Works



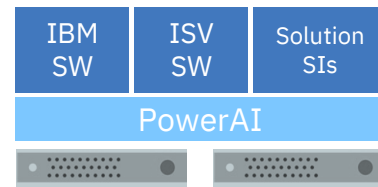
Ease of Use, Unique Capabilities



Faster Model Training Time



Open AI Platform w/ Ecosystem Partners



Curate, Test, and Support Fast Moving Open Source

Provide Enterprise Distribution on RedHat

Easy to deploy Enterprise AI Platform

Large data & model support due to NVLink

Acceleration of Analytics & ML

AutoML: PowerAI Vision

Elastic Training: Scale GPUs as Required

Faster Training Times in Single Server

Scalability to 100s of Servers (Cluster level Integration)

Leads to Faster Insights and Better Economics

Platform that Partners can build on

Software Partners: H2O, IBM, Anaconda

SIs, Solution Vendors & Accelerator Partners

Deep learning is memory constrained

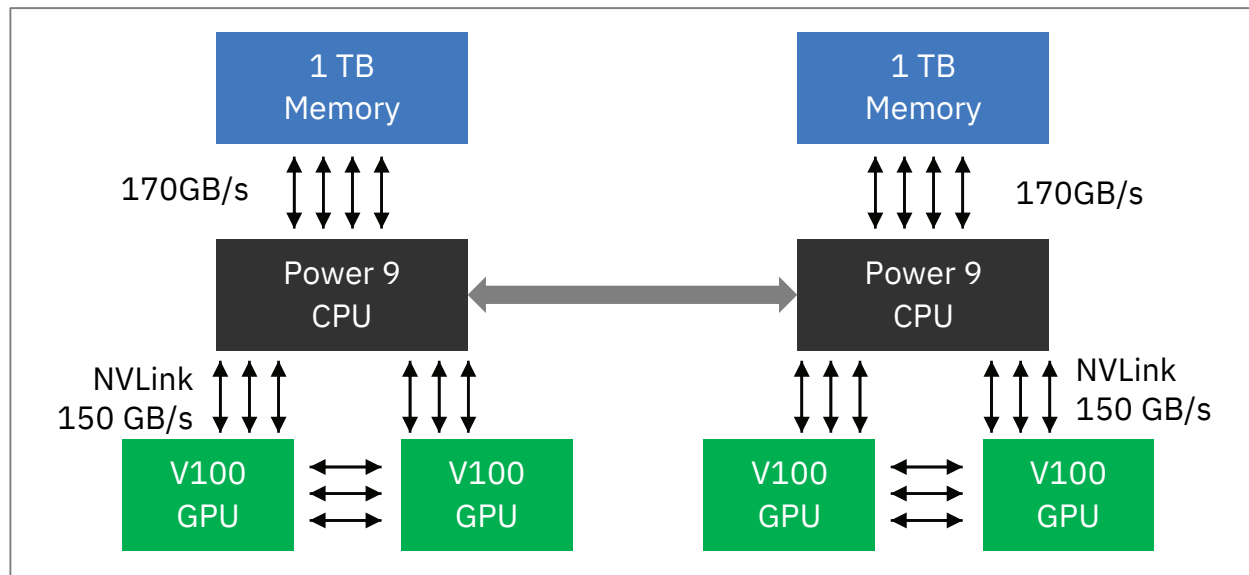
- GPUs have limited memory
- Neural networks are growing deeper and wider
- Amount and size of data to process is always growing

5x Faster Data Communication with Unique CPU-GPU NVLink High-Speed Connection

Store Large Models
in System Memory

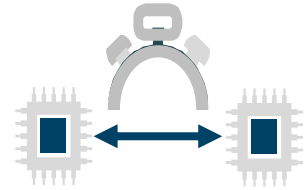
Fast Transfer
via NVLink

Operate on One
Layer at a Time



IBM AC922 Power System
Deep Learning Server (4-GPU Config)

Acceleration in training ... days become hours



Performance...
Faster Training
and Inferencing

**Large AI Models Train
~4 Times Faster
POWER9 Servers with NVLink to
GPUs
VS
x86 Servers with PCIe to GPUs**

**faster training times
for data scientists**

Distributed Deep Learning



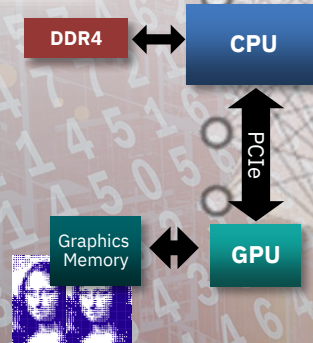
Traditional Model Support



Large Model Support

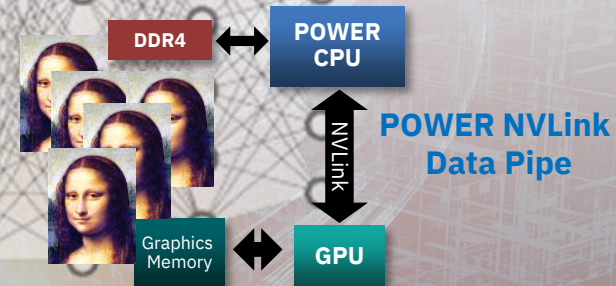
(Competitors)

Limited memory on GPU forces
trade-off in model size / data
resolution

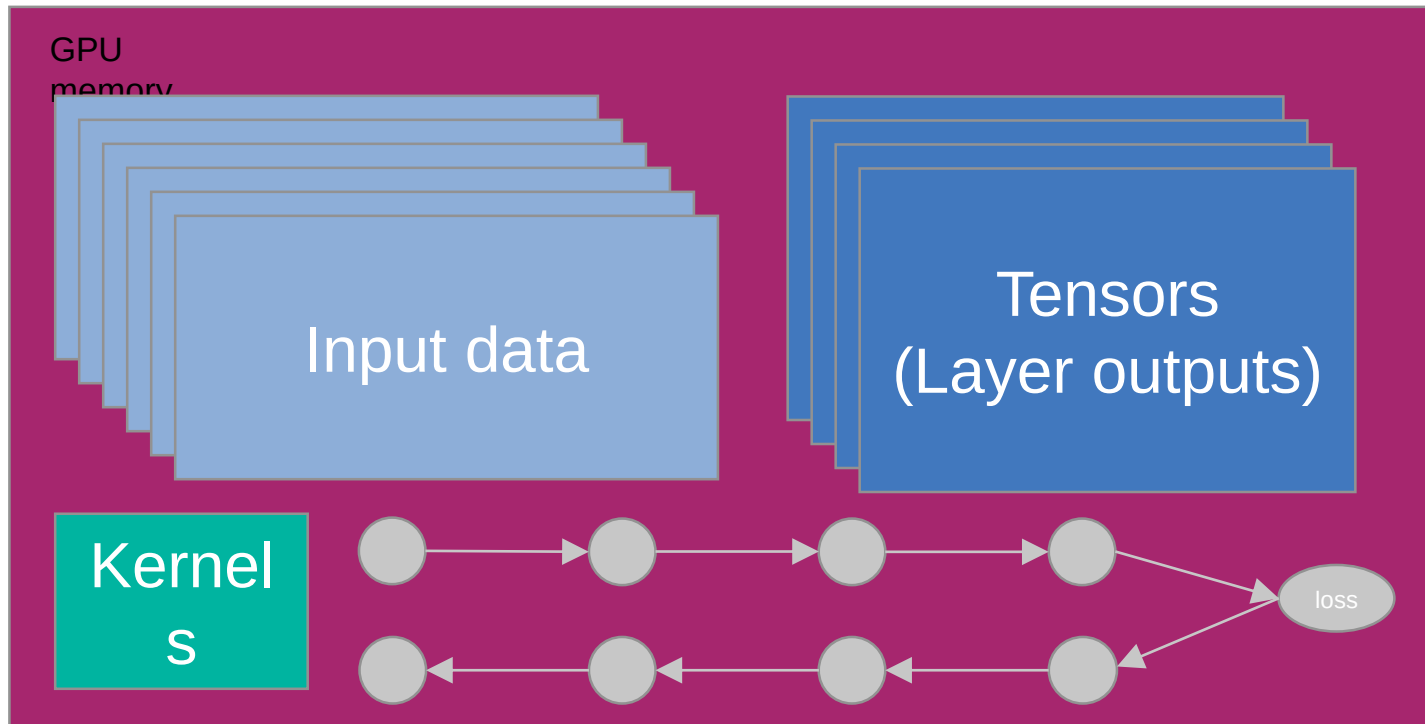


(PowerAI)

Use system memory and GPU
to support more complex models
and higher resolution data



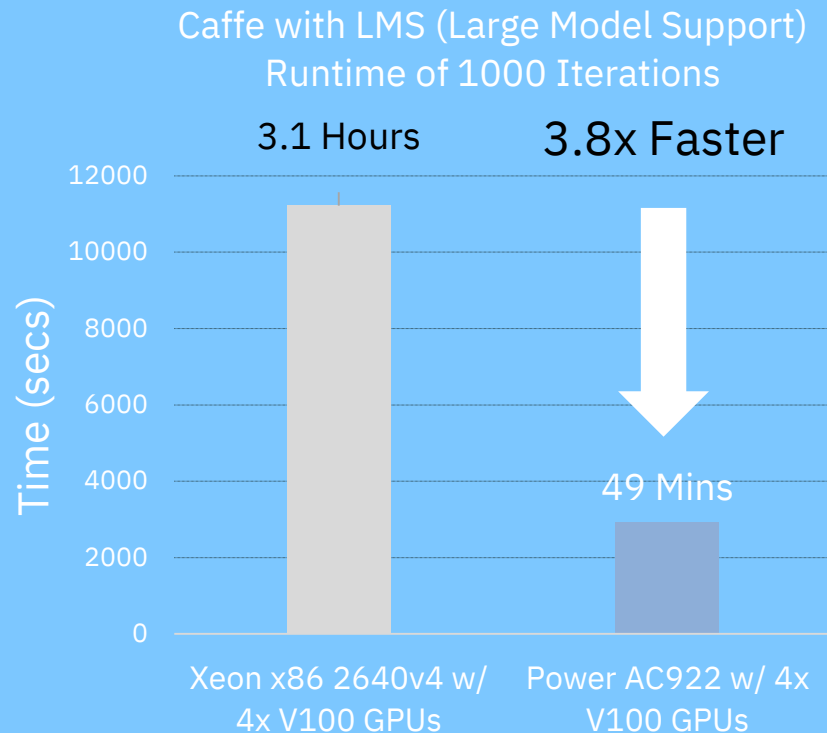
Gpu memory usage



Large AI Models Train ~4 Times Faster

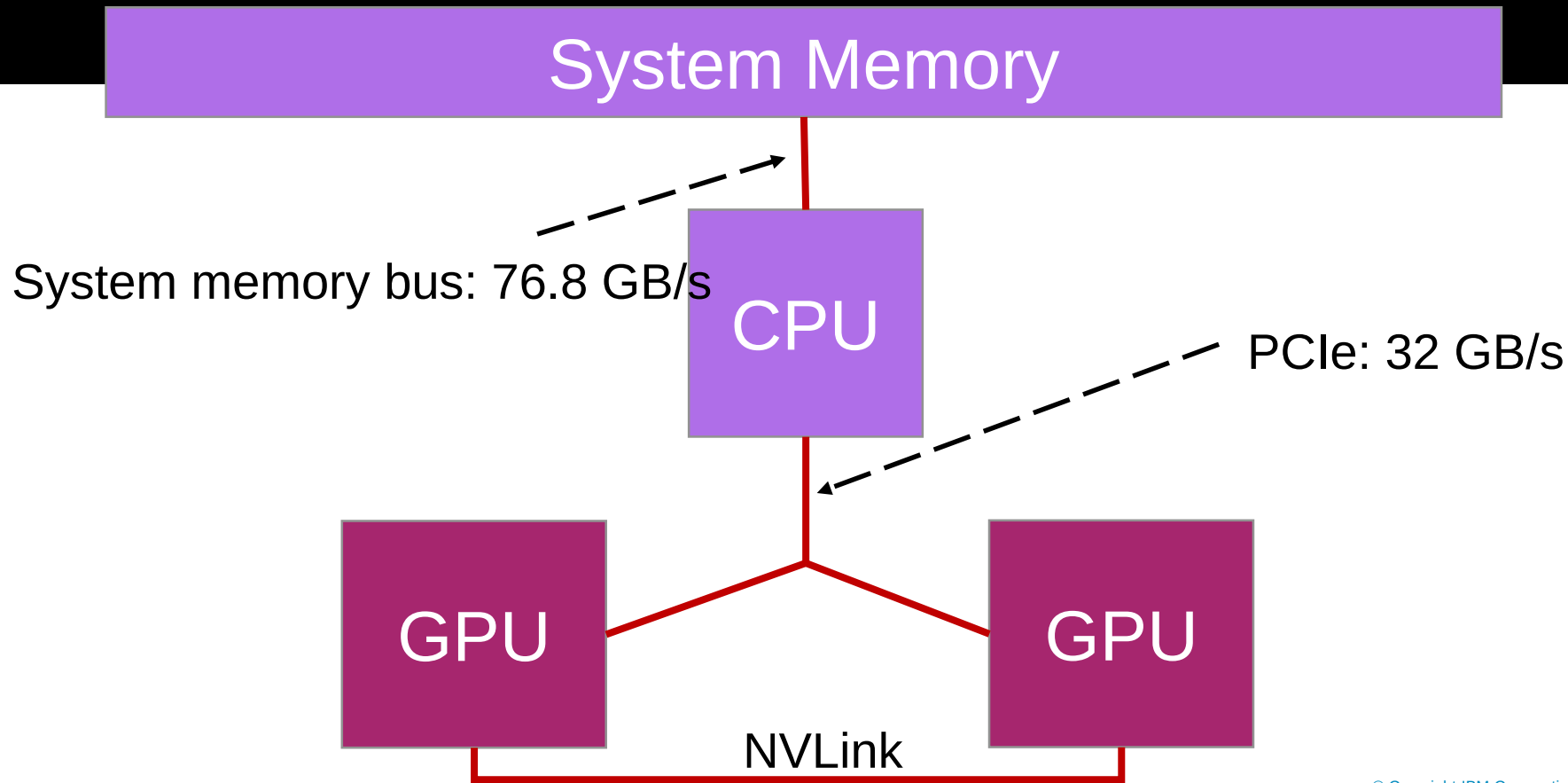
POWER9 Servers with NVLink to GPUs
VS
x86 Servers with PCIe to GPUs

Detailed Benchmark Information in Back

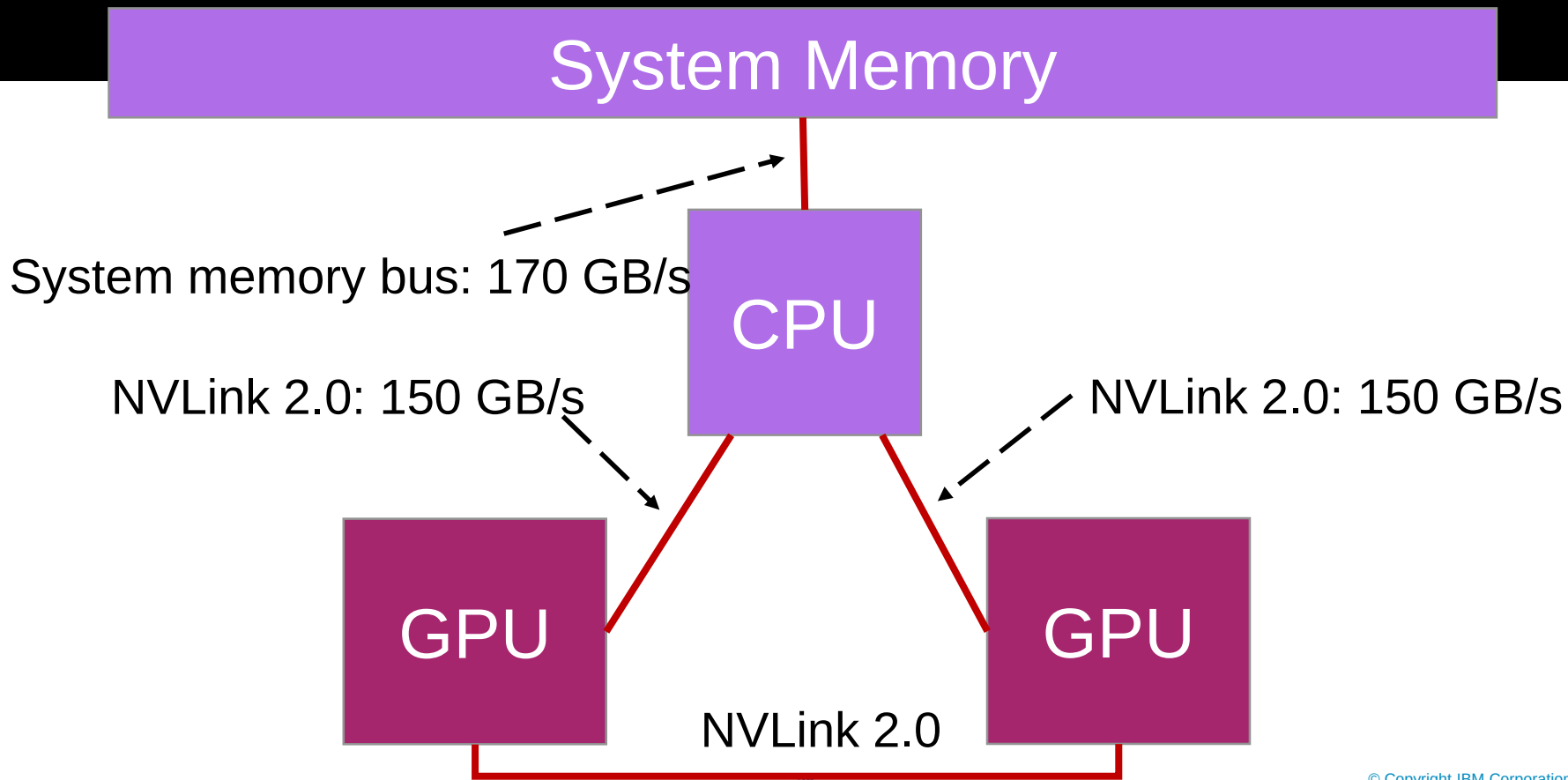


GoogleNet model on Enlarged
ImageNet Dataset (2240x2240)

Typical GPU connectivity



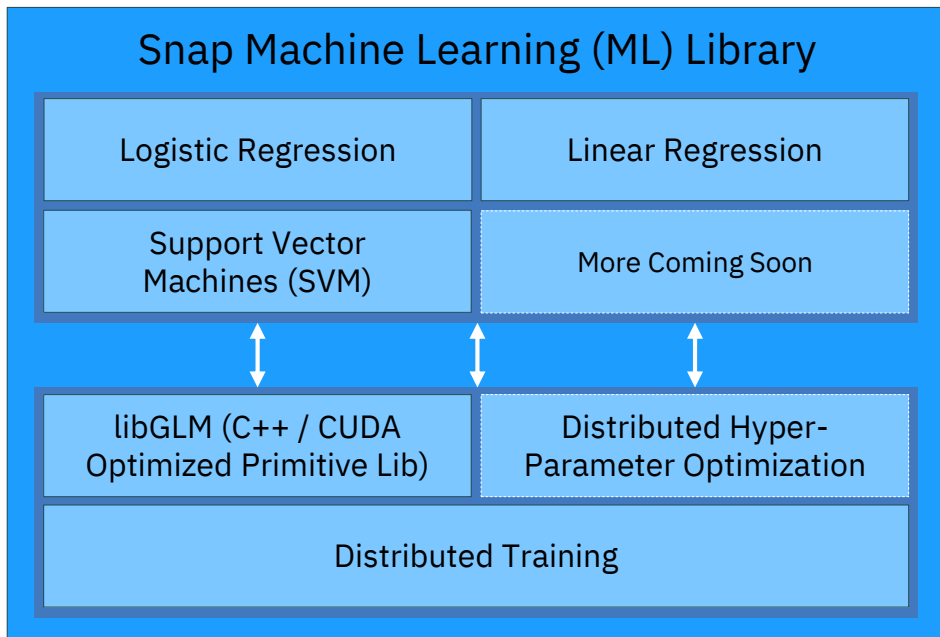
Nvlink cpu to GPU connectivity



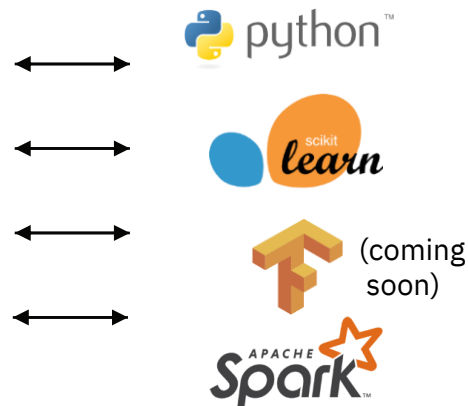
- Accelerated Machine Learning

Snap ML

Distributed GPU-Accelerated Machine Learning Library



APIs for Popular ML Frameworks



4 APIs

[pai4sk API](#) (Included in PAI 1.5.4)
[snap-ml-local API](#)
[snap-ml-mpi API](#)
[snap-ml-spark API](#)

- Snap ML: Training Time Goes From An Hour to Minutes

46x faster than previous record set by Google

Workload: Click-through rate prediction for advertising

Logistic Regression Classifier in Snap ML using GPUs vs TensorFlow using CPU-only

Dataset: Criteo Terabyte Click Logs

(<http://labs.criteo.com/2013/12/download-terabyte-click-logs/>)

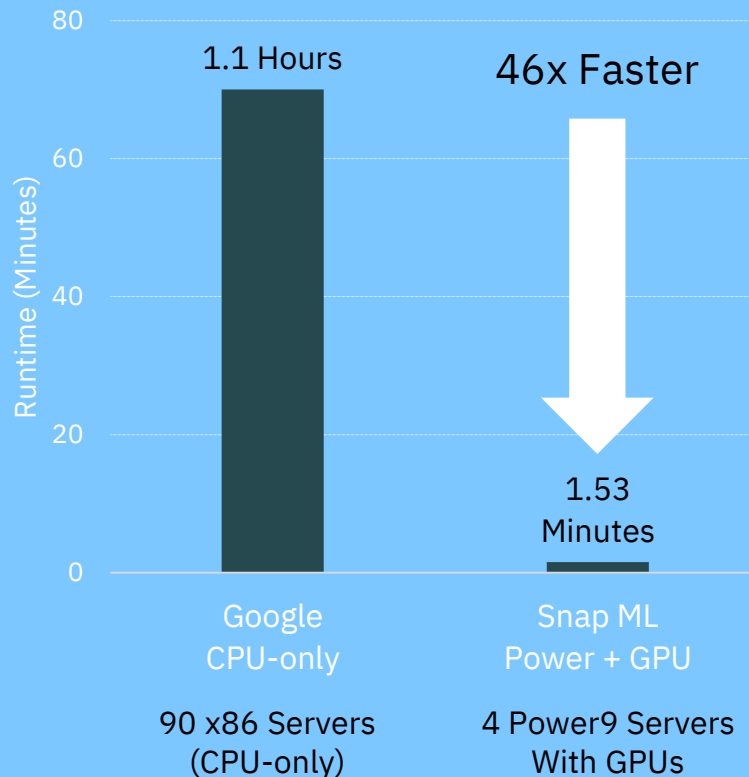
4 billion training examples, 1 million features

Model: Logistic Regression: TensorFlow vs Snap ML

Test LogLoss: 0.1293 (Google using Tensorflow), 0.1292 (Snap ML)

Platform: 89 CPU-only machines in Google using Tensorflow versus 4 AC922 servers (each 2 Power9 CPUs + 4 V100 GPUs) for Snap ML
Google data from [this Google blog](#)

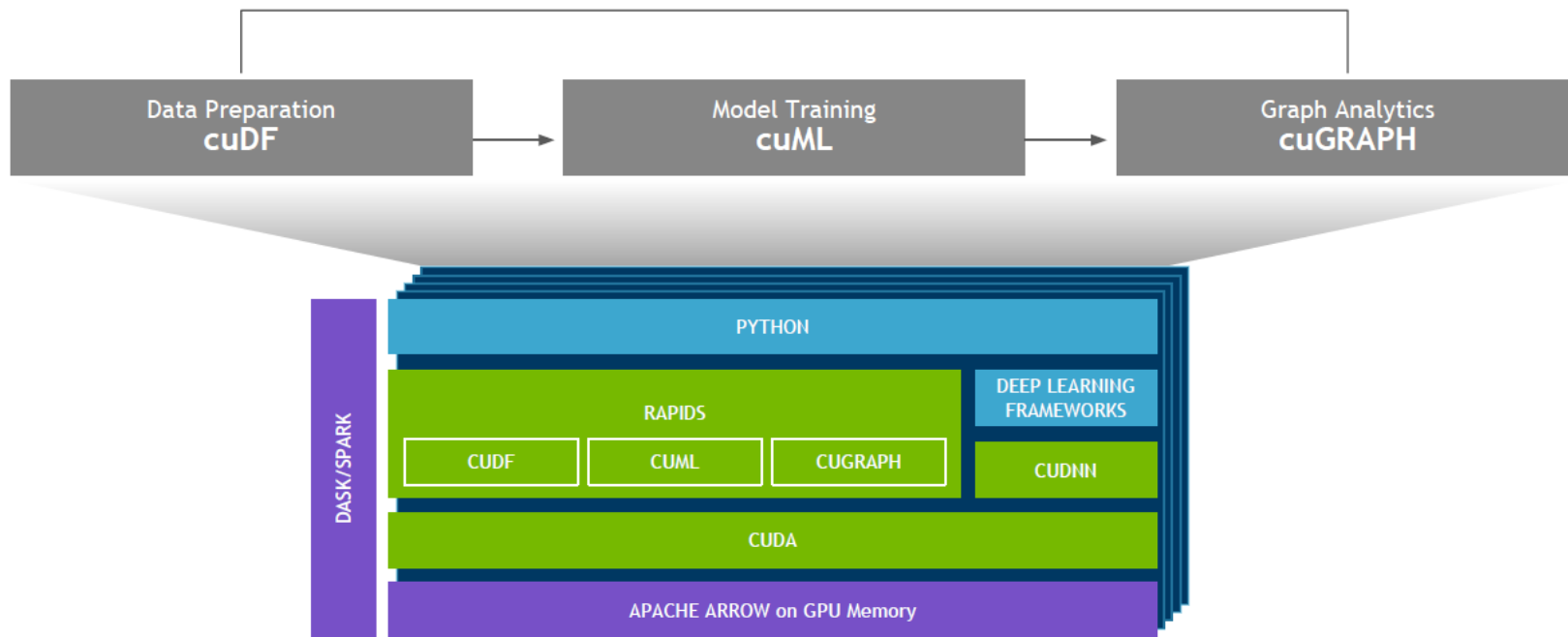
Logistic Regression in Snap ML (with GPUs) vs TensorFlow (CPU-only)



Nvidia RAPIDS – Open GPU Data Science

PowerAI 1.6 support

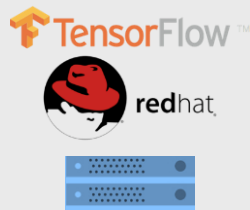
Software Stack Python



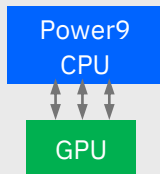
- Solutions based on PowerAI
Accelerate ++ & increase productivity

PowerAI: Enterprise AI Platform

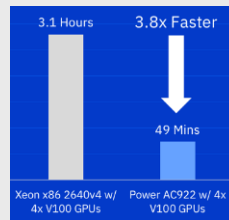
Simplicity: Integrated Platform that Just Works



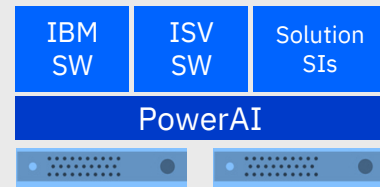
Ease of Use, Unique Capabilities



Faster Model Training Time



Open AI Platform w/ Ecosystem Partners



Curate, Test, and Support Fast Moving Open Source

Provide Enterprise Distribution on RedHat

Easy to deploy Enterprise AI Platform

Large data & model support due to NVLink

Acceleration of Analytics & ML

AutoML: PowerAI Vision

Elastic Training: Scale GPUs as Required

Faster Training Times in Single Server

Scalability to 100s of Servers (Cluster level Integration)

Leads to Faster Insights and Better Economics

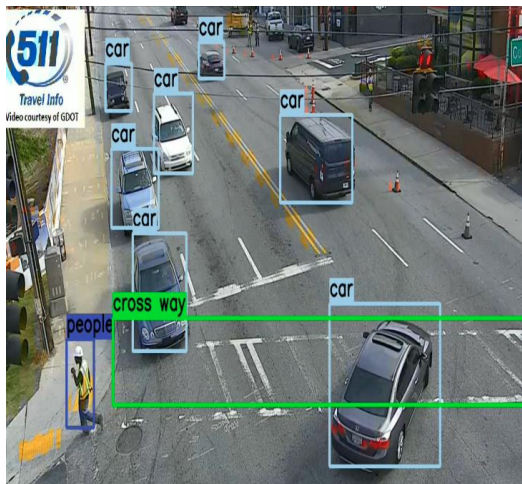
Platform that Partners can build on

Software Partners: H2O, IBM, Anaconda

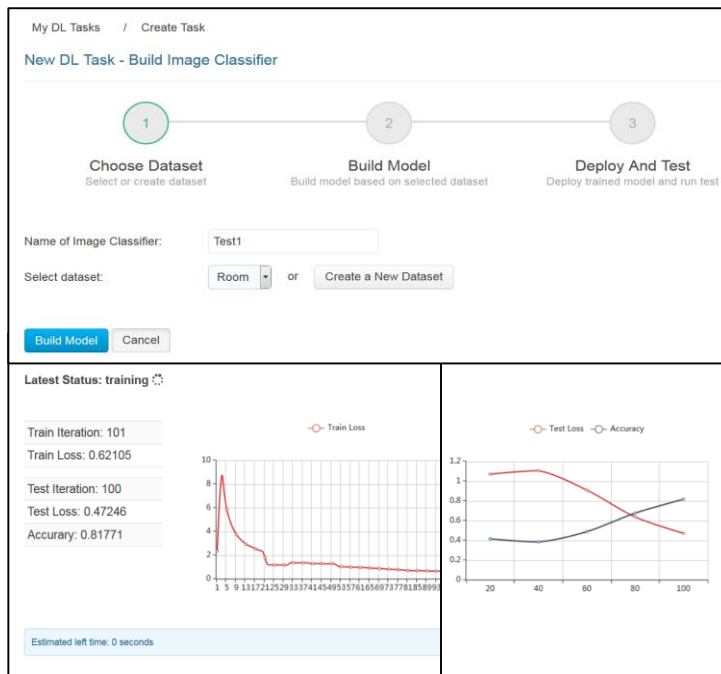
SIs, Solution Vendors & Accelerator Partners

PowerAI Vision: "Point-and-Click" AI for Images & Video

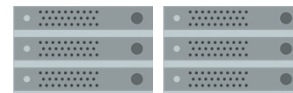
Label Image or
Video Data



Auto-Train AI
Model

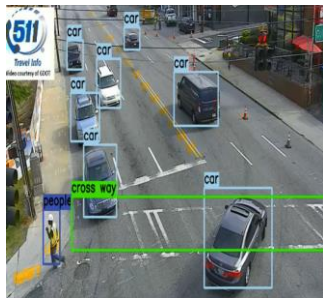


Package & Deploy
AI Model



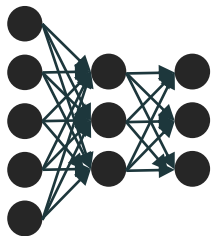
Semi-Automatic Labeling using PowerAI Vision

Manually Label



Define Labels
Manually Label Some
Images / Video Frames

Train DL Model

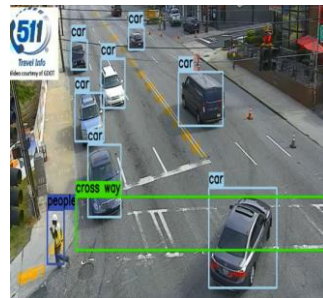


Use Trained DL Model



Run Trained DL Model
on Entire Input Data
to Generate Labels

Correct Labels
on Some Data



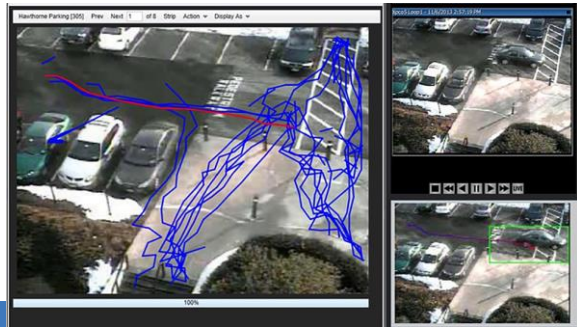
Manually Correct
Labels on Some Data

Repeat Till Labels Achieve
Desired Accuracy

IBM Intelligent Video Analytics (IVA)

Video Analytics Software with Pre-Trained AI Models
Complex Event Monitoring with GUI-based Configuration
Targeted at Public Safety, Remote Monitoring, etc

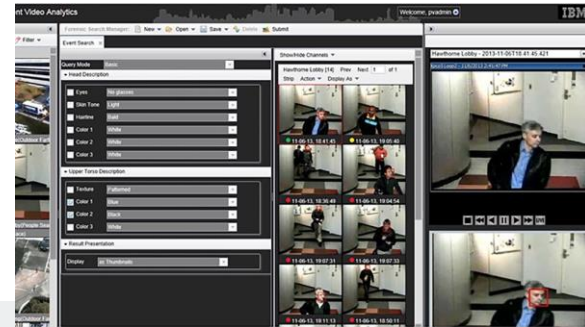
Detect Changes
to Patterns



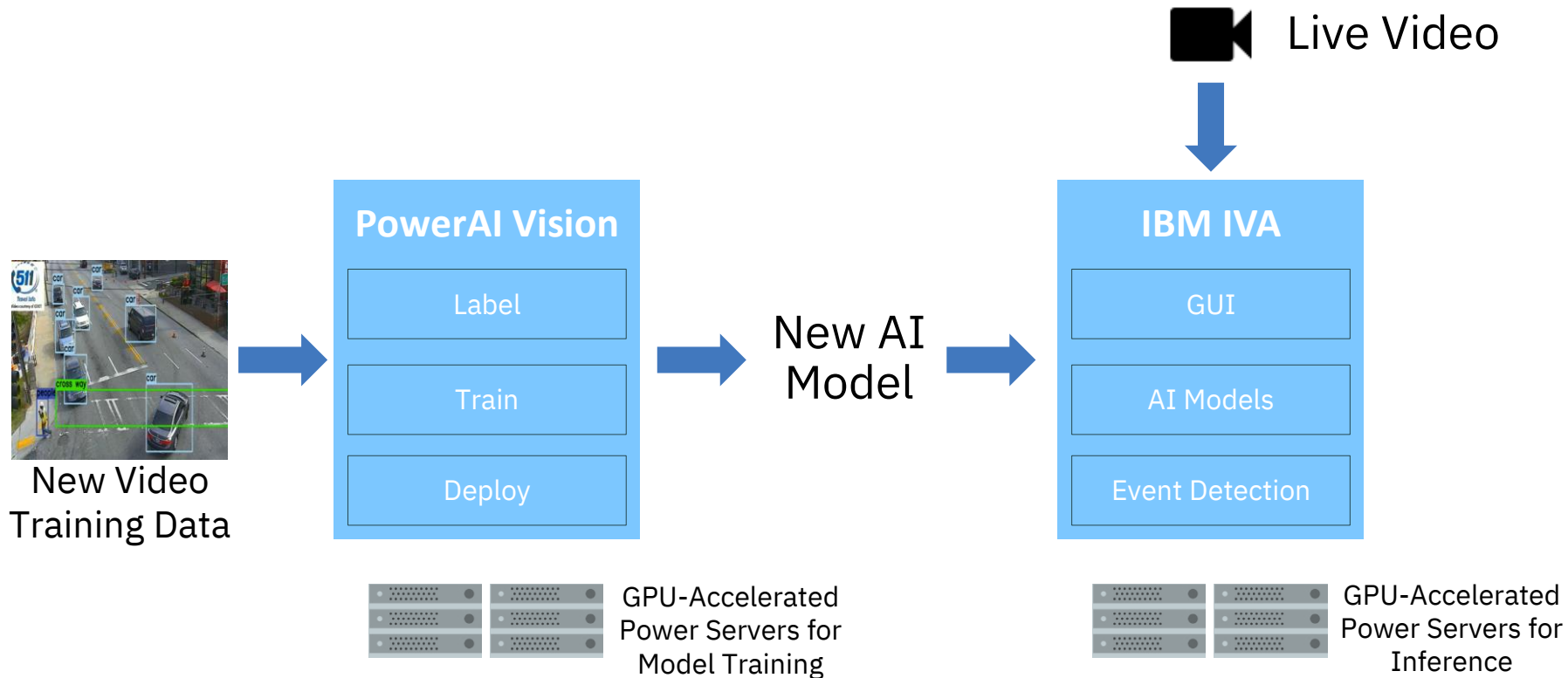
Redaction of Faces



Facial Recognition
& People Search

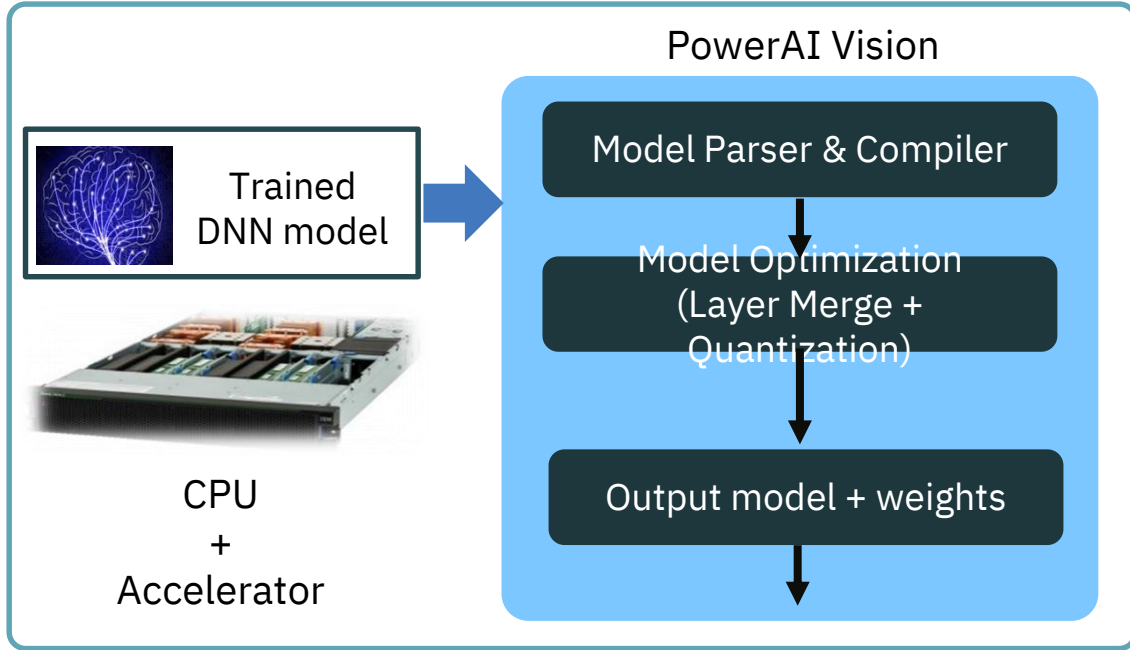


Announcing PowerAI Vision Integration with IBM IVA

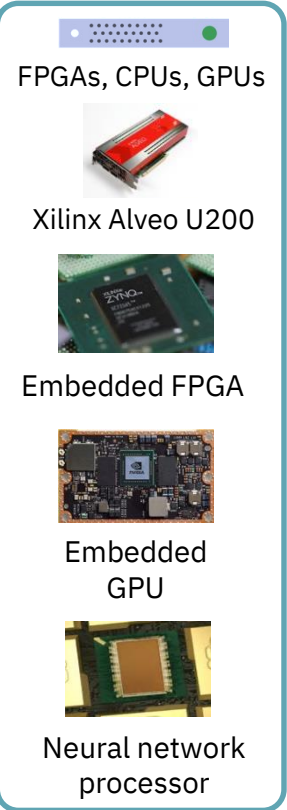


Deploying Trained Models

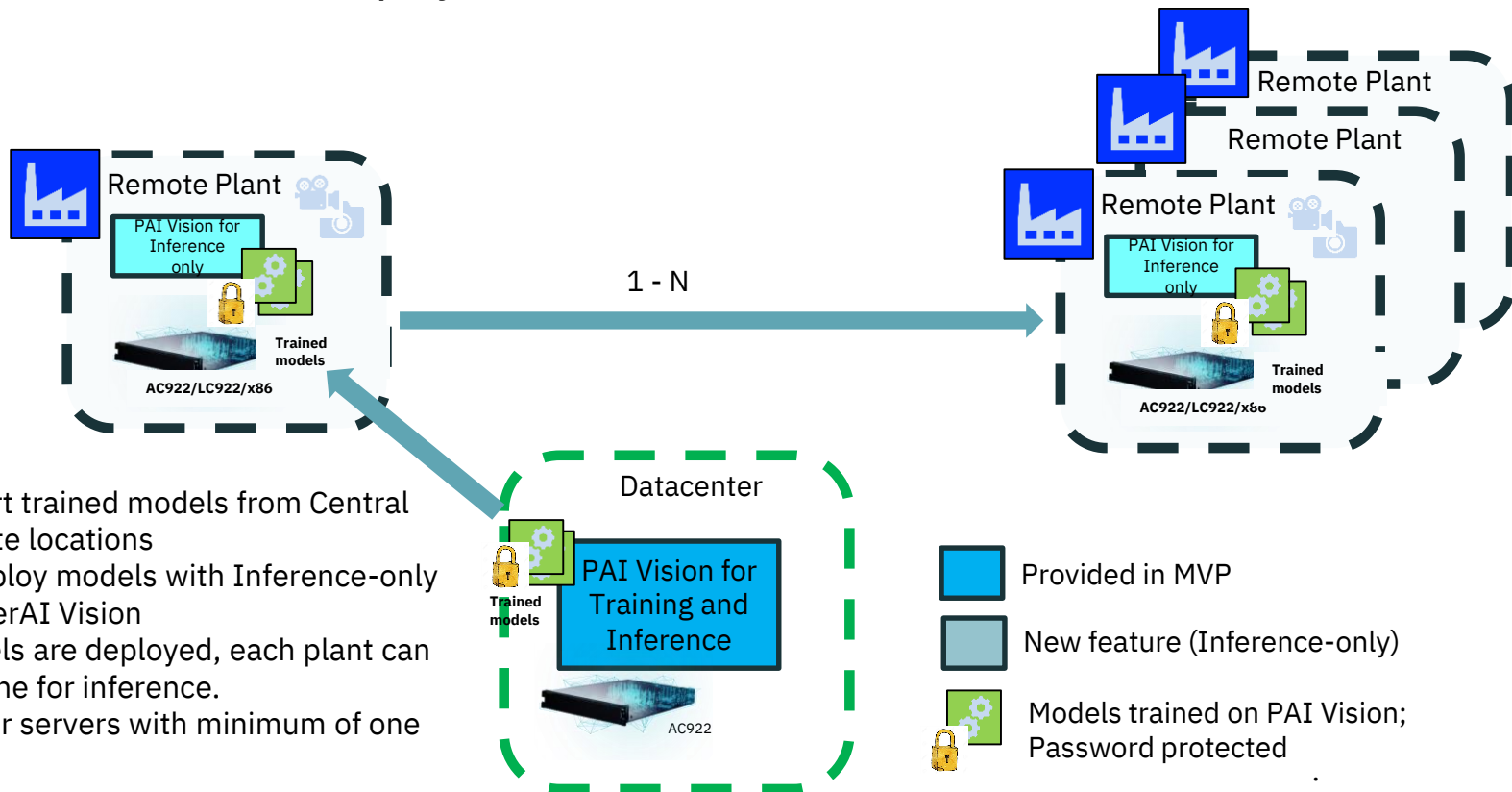
Data Center: Train model & Compile to Edge



Cloud or Edge



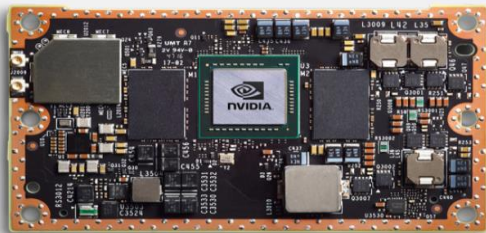
Train on central server but deploy on several remote servers



1. Manually export trained models from Central server to remote locations
2. Import and deploy models with Inference-only license of PowerAI Vision
3. Once the models are deployed, each plant can work stand alone for inference.
4. Supports Power servers with minimum of one GPU

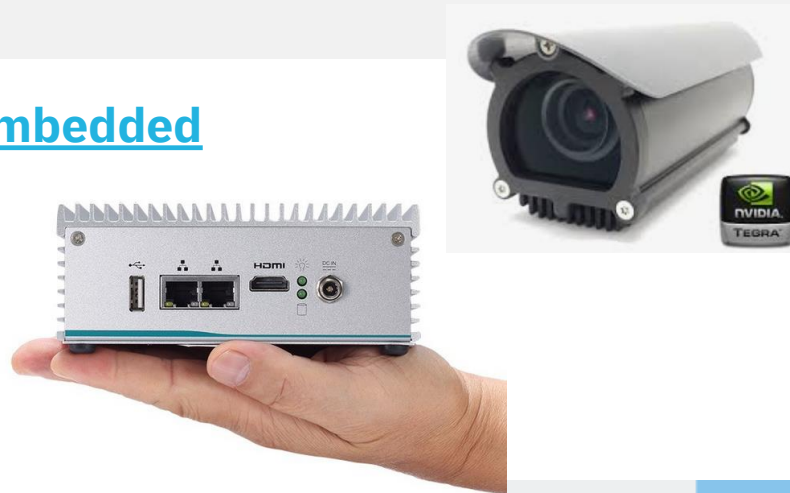
Accelerated embedded edge devices

NVIDIA Jetson TX2 Module



Jetson TX2 is the fastest, most power-efficient embedded AI computing device. This 7.5-watt supercomputer on a module brings true AI computing at the edge. It's built around an NVIDIA Pascal™-family GPU and loaded with 8GB of memory and 59.7GB/s of memory bandwidth. It features a variety of standard hardware interfaces that make it easy to integrate it into a wide range of products and form factors.

Train on PowerAI Vision but infer on embedded devices





Retail Analytics

Track how customers navigate store, identify fraudulent actions, detect low inventory for items

IVA generates track summary, flags missing objects, alerts on suspicious behavior



Worker Safety Compliance

Utilize surveillance cameras to ensure worker safety compliance

IVA enables zone monitoring, heat maps, detection of loitering



Remote Inspection & Asset Management

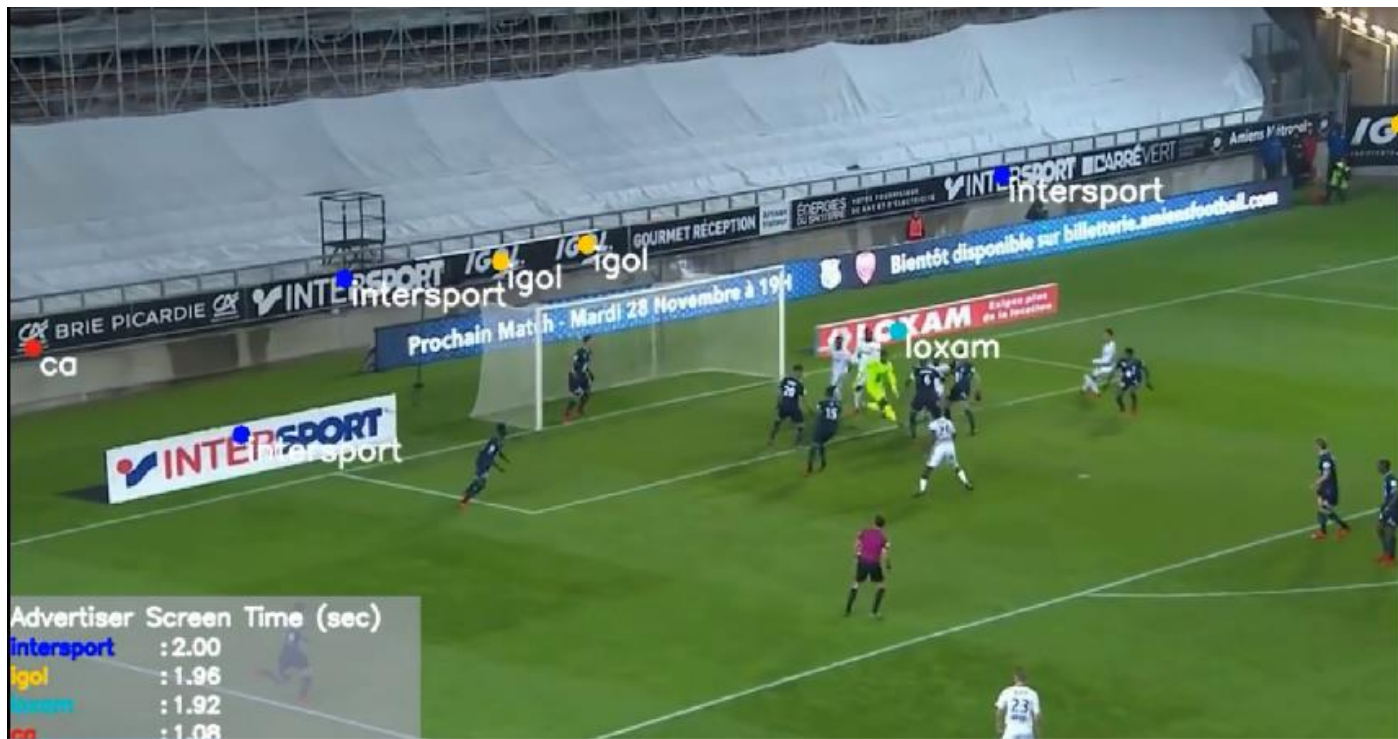
Identify faulty or worn out equipment in remote & hard to reach locations

IVA can alert to schedule maintenance job, along with critical infrastructure security

Made with PowerAI Vision – Drone Inspection

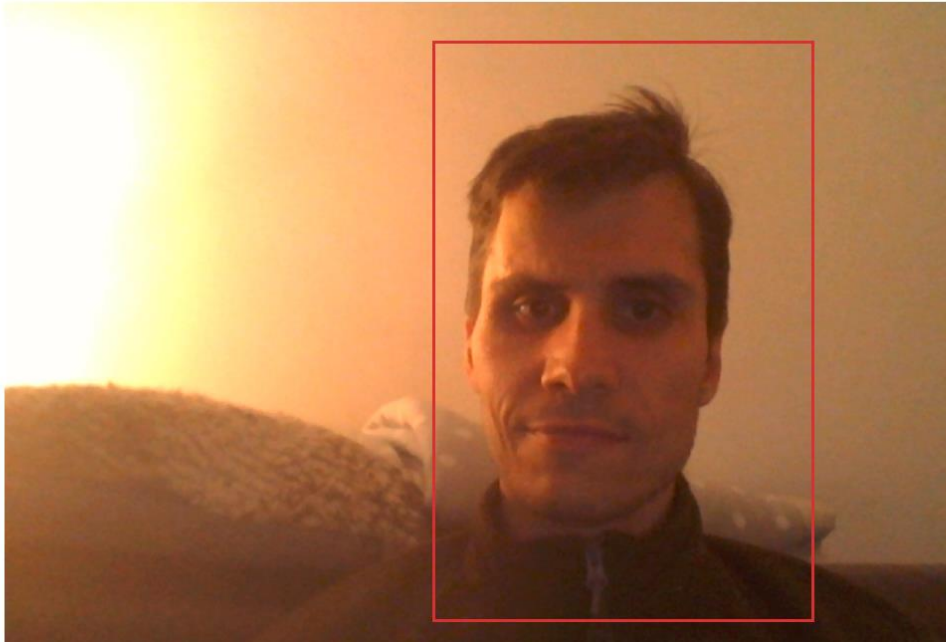


Made with PowerAI Vision – Sport / Advertising



Made with PowerAI Vision – Real time detection on IBM i

☐ Integrated Camera (5986:0366)



Visual Recognition Demo on IBM i + PowerAI Vision



PowerAI Vision

- IBM Watson Studio Local & ICP for Data

Collaborative toolset for increasing productivity

End to end AI project lifecycle

Takes benefit of the PowerAI innovations & optimized frameworks

Core Attributes of Watson Studio

- IBM Watson Studio (aka DSX) is available

- ☐ As a cloud offering aka **Watson Studio**

- ☐ As a desktop application

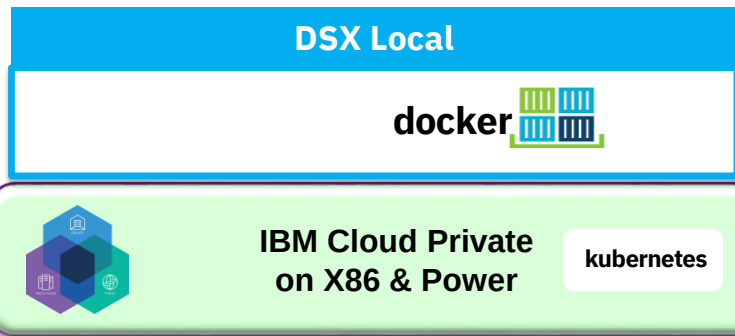
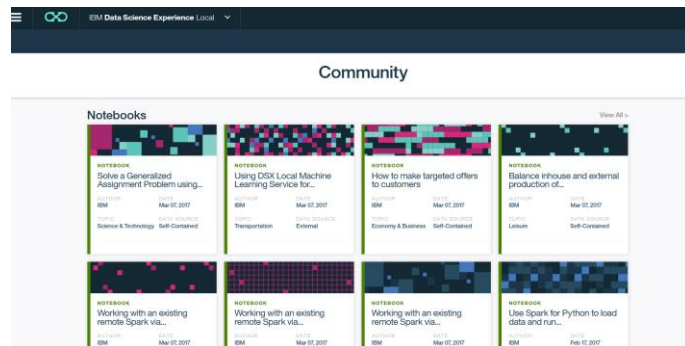
- Free, disconnected mode

- ☐ As an on-premises solution

- ☐ **DSX Local now Watson Studio Local**
on x86/Power

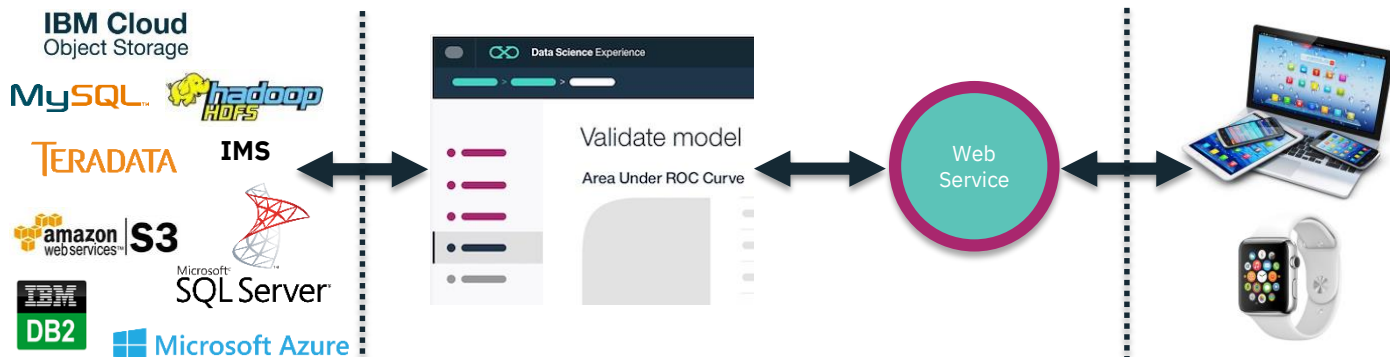
- ☐ Power: Scale-out LC Systems
with PowerAI + GPU / Nvlink acceleration

- ☐ Possible private cloud deployment
with IBM Cloud Private



Build Predictive models with Watson Studio

IBM Machine Learning



Data Access:

- Easily connect to Behind-the-Firewall and Public Cloud Data
- Catalogued and Governed Controls through Watson Data Platform

Creating Models:

- Single UI and API for creating ML Models on various Runtimes
- Auto-Modelling and Hyperparameter Optimization

Web Service:

- Real-time, Streaming, and Batch Deployment
- Continuous Monitoring and Feedback Loop

Intelligent Apps:

- Integrate ML models with apps, websites, etc.
- Continuously Improve and Adapt with Self-Learning

Kubernetes/IBM Private Cloud w/ PowerAI : Build your own AI Private Cloud

User1 – Web Browser

PowerAI Vision



IBM Data Science Experience

H₂O.ai

User2

IBM PowerAI

User3 – Web Browser

IBM PowerAI



Watson Studio



IBM Watson



IBM Cloud

IBM Cloud Private

Catalogue



with GPU

GPU as a Service
On demand

GPU as a Service
Dedicated

PowerAI Vision

Kubernetes

Worker Node: Power AI

Deep Learning Framework

Supporting Libraries

GPU

GPU

GPU

GPU

Worker Node: Power AI

Deep Learning Framework

Supporting Libraries

GPU

GPU

GPU

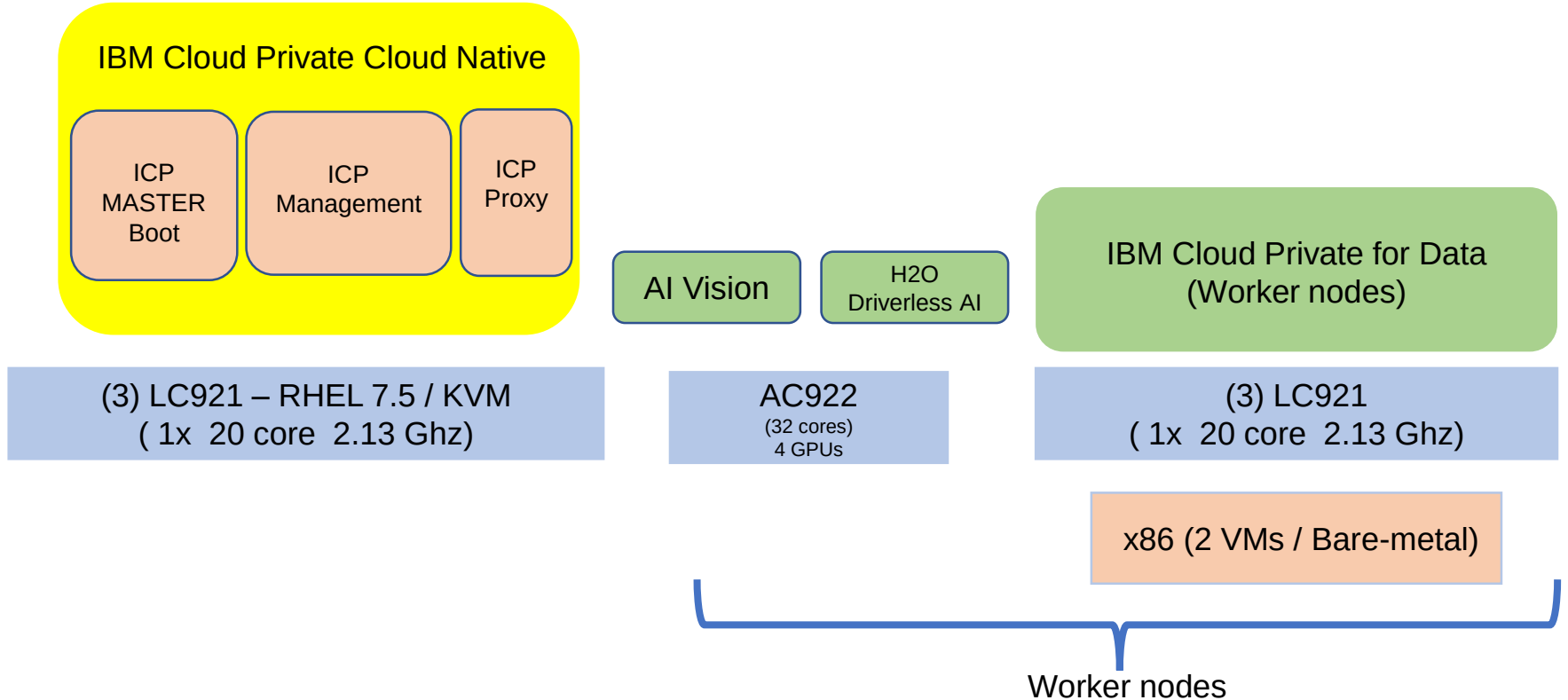
GPU

X86 and VMWare

Master Node

Worker Node

ICP + ICP4Data + PowerAI Vision + H2O Driverless AI



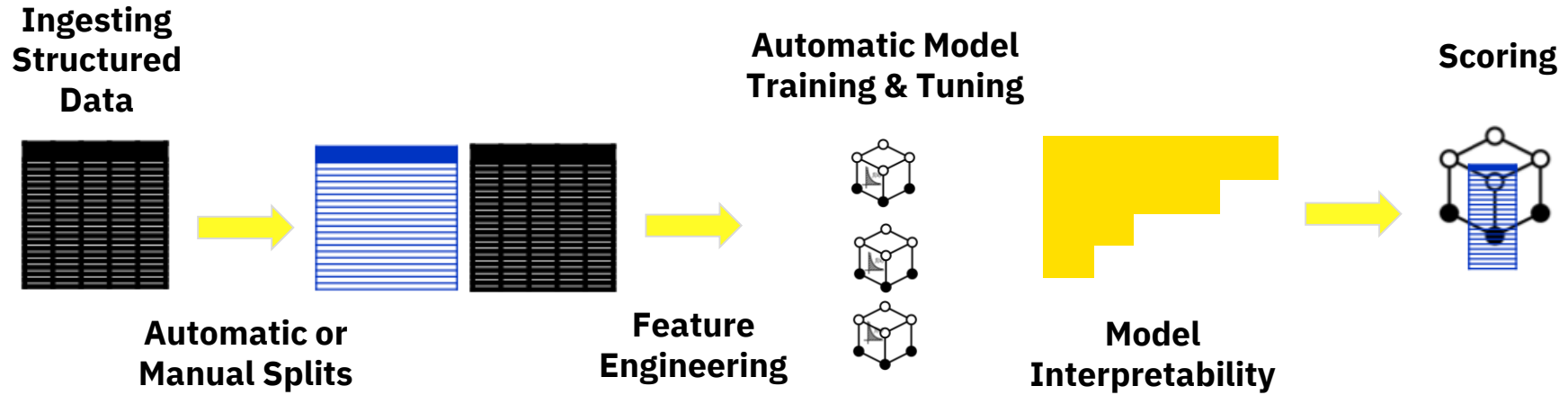
- H2o.ai Driverless AI on Power
Toolset for increasing productivity
Accelerated ML
End to end AI project lifecycle

IBM PowerAI

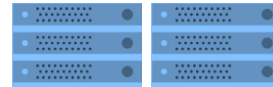
H₂O.ai

IBM.

H2O Driverless AI: Automated Machine Learning



Optimized for GPU-Accelerated Power9 Servers



H₂O.ai

Financial Fraud Detection



- Driverless AI matched **10 years** of expert feature engineering
- Increased accuracy from **0.89 to 0.947 (6%)** in detecting fraudulent activity
- **6X** speed up when using H2O4GPU with Driverless AI

Experiment

- Training time (subset of data) – Driverless AI on GPU 6x faster
 - laptop (accuracy 1) - ~ 2 hours
 - GPU (accuracy 1) – 21 minutes; (accuracy 5) – 58 minutes

ID	TARGET	TRAIN SCORE	TEST SCORE	SCORER	ACCURACY	TIME	INTERPRETABILITY	STATUS	TIME
13c6ca	is_cc_bad	0.94703	NA	AUC	1	1	1	Done	01:53:29
067d32	is_cc_bad	0.94773	NA	AUC	5	5	5	Done	00:58:39
e55093	is_cc_bad	0.94658	NA	AUC	1	1	1	Done	00:21:59

“Driverless AI is giving amazing results in terms of feature and model performance “

Venkatesh Ramanathan
Senior Data Scientist, PayPal

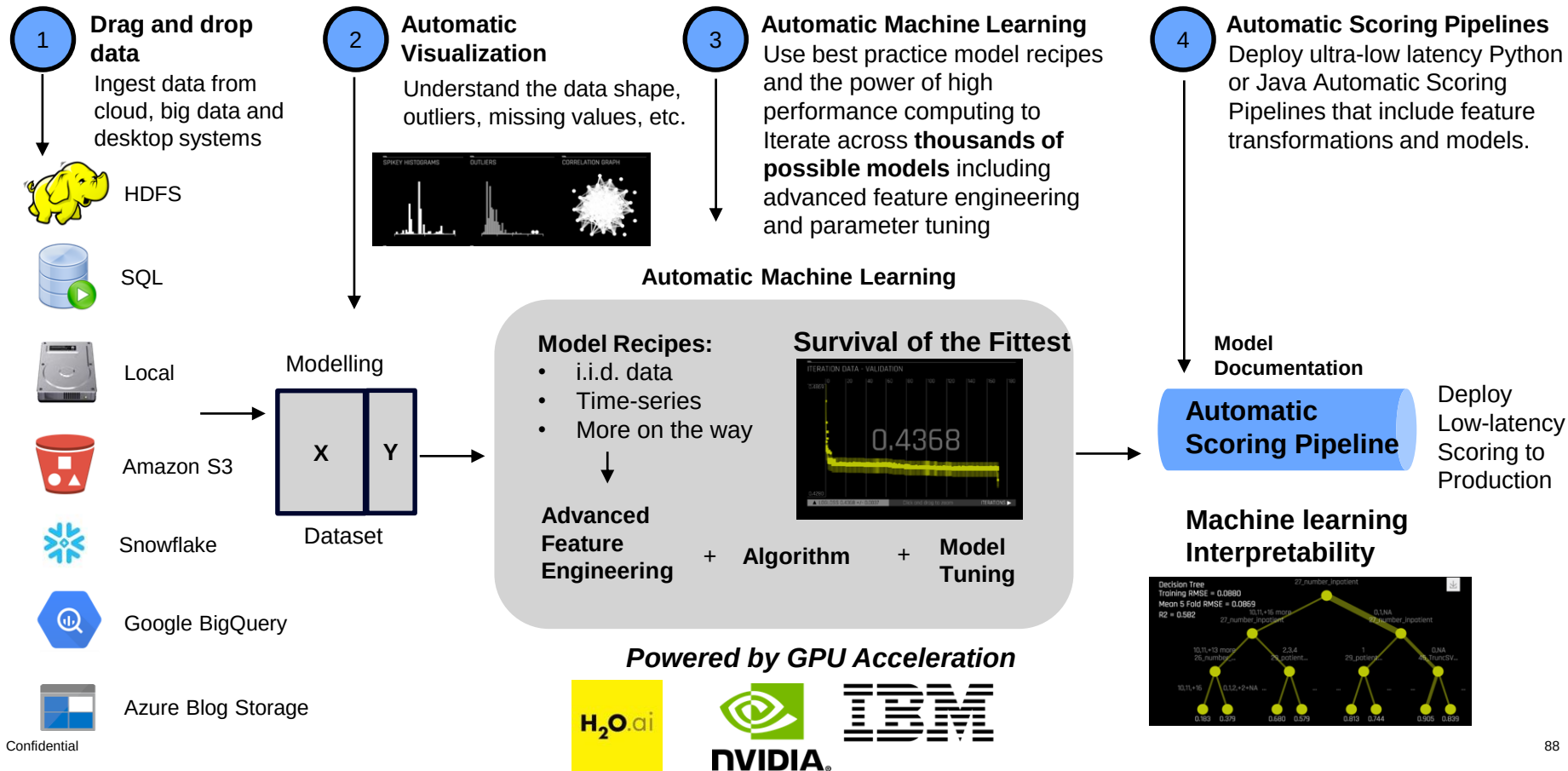
**Leader in Gartner's 2018
Data Science Quadrant**

H2O Driverless AI and IBM POWER9 GPU Systems are bringing together the best of breed AI innovation. To handle the increasingly complex workloads of AI you need an integrated system of software and hardware:

- IBM POWER9 supports nearly 2.6x more RAM, 9.5x more I/O bandwidth than comparable systems.
- Nearly 2X the data ingest speed and over 50% faster feature engineering.
- With GPU accelerated machine learning delivering nearly 30X speedup on model building.
- Support for up to 6 V100 GPUs on a single system.

H2O.ai

H2O Driverless AI: How it Works

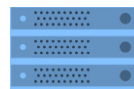


Made with Driverless AI to make smarter IBM i apps

Sales + CRM data



Optimized for GPU-Accelerated Power9 Servers



Recommendation Engine
Scoring Pipeline - REST API



```
[14:57:33] [sp4i-appserver.power.com] [/home/BENOIT/DAI]# uname -a
OS400 sp4i-appserver 2 7 00100006C37T
[14:57:37] [sp4i-appserver.power.com] [/home/BENOIT/DAI]# ./run_h2o_prediction_from_ibmi.sh M 21.0 Married Retail
This example script demonstrates how to communicate with the Driverless AI Scoring Service via HTTP from IBM i - PASE / Open Source / Any REST Client
The protocol used is JSON-RPC 2.0.

Name Type Range Value
-----
GENDER object - M
AGE float32 [17.0, 69.0] 21.0
MARITAL_STATUS object - Married
PROFESSION object - Retail

Scoring individual rows from IBM i App...
{"jsonrpc": "2.0", "id": 1, "result": [0.7058841586112976, 0.03077976033091545, 0.04269004985690117, 0.022570349276065826, 0.19807571172714233]}
Get the target labels
{"jsonrpc": "2.0", "id": 1, "result": ["Camping Equipment", "Golf Equipment", "Mountaineering Equipment", "Outdoor Protection", "Personal Accessories"]}
```

		Deep Learning			ML and DL	Machine Learning
		Power AI Base (WML-CE)	Power AI Enterprise (WML-A)	AI Vision	Watson Studio Local	H2O Driverless AI
Offering	Description	Deep Learning	Deep Learning for the Enterprise	Deep Learning with Video tools	Notebook oriented development environment for ML and DL	Automated Machine learning
	Pricing Model	Free download	Commercial	Commercial	Commercial	Commercial
	Support	Available from IBM	IBM L 1-3 Included	IBM L1-3 Included	Available from IBM	H2O L 1-3
Applications	Text & Numeric	Yes	Yes	No	Yes	Yes
	Images	Yes	Yes	Yes	Yes	No
	Video	-	Optional add-on	Yes		No
	Primary Persona	Data Scientist	Data Scientist	Line of Business	Data Scientist	Data Scientist
	Second persona	IT	IT	IT	IT	Line of Business
	User Skill Level	High	Medium to high	Low	Medium to high	Low to Medium
Strengths		Rapid deployment, high performance, scale	enterprise grade, High performance, rapid Deployment	Rapid deployment, simple GUI high performance	Notebook based development environment, strong collaboration, model management	Simplified deployment, intuitive user interface, automatic pipelines, "explainability" for models, end to end automation
Platform	Distributed DL (DDL)	1-4 nodes	1-thousands of nodes	Coming	Coming	-
	Large Model Support	Yes	Yes	Coming	Coming	-
	Server(s)	S822LC or AC922	S822LC or AC922	S822LC or AC922	S822LC or AC922, LC922	S822LC, AC922, LC921/922
IBM Products	Spectrum MPI (DDL)	Limited to 4 nodes	Included			Optional add-on
	Spectrum Conductor DLI	Optional add-on	Included	Coming	Optional Add On	Optional add-on
	IBM DSX Local	Optional add-on	Optional add-on	No		Optional add-on
Cloud	IBM Cloud Public	Yes	No	Trial only	Watson Studio	?
	IBM Cloud Private	Yes	Coming	Yes	Yes	Coming



500+ POWERAI CLIENTS WITHIN ONE YEAR

40% NEW TO POWER



- How to get Started? Pricing

AI Developer Box & AI Starter Kit

Power AI Developer Box	AI Starter Kit for Data Scientists
Free 30-Day Licenses for PowerAI Vision & WML Accelerator (free to Academia)  Power9 + GPU Desktop PC: \$3,449 Order from: https://raptorcs.com/POWERAI/	WML Accelerator Pre-installed (formerly called PowerAI Enterprise)  2 AC922 Power9 + GPU Servers + 1 Linux Storage Server

Target street price \$230K

IBM S822LC

POWER8

20 cores

4 - P100 GPUs

256GB RAM

IBM AC922

POWER9

32 cores

4 - V100 GPUs

256GB RAM

DELLC4130

x86 Broadwell

28 cores

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POWER / x86

Price Index

POWER8

vs. Broadwell



vs. Broadwell

Hardware List Price

\$67,054

Hardware List Price

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Hardware List Price

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TCA Street Price

\$53,654

TCA Street Price

\$55,083

TCA Street Price

\$70,055

TensorFlow

70

TensorFlow

140

TensorFlow

70

TCA Price/Performance

\$766

TCA Price/Performance

\$393

TCA Price/Performance

\$1001

Hardware List Price Ratio

0.77

0.77

TCA Street Price Ratio

0.77

0.77

TCA Price Performance Ratio

0.77

0.39



HIGHLIGHTS

- Getting questions on GPU pricing compared to on-line pricing? IBM's net price is competitive!
 - Dell List price for a Tesla V100 GPU is \$16,919 vs. \$11,499 in AC922
- Drive home AC922 GPU efficiency versus commodity x86 servers ... CPU $\leftrightarrow$ NVLink and LMS is a differentiator
- P8 to P9 accelerated computing servers are a price point replace at 256GB memory capacities

Start your Journey

Offering details

- [Introduction to IBM PowerAI Vision](#)
- [Developer Works](#)

Access to Software

- [Trial edition, FREE for 30 days](#)
- [Low cost accelerated HW from Raptor](#)
- As a service on [NIMBIX](#) & [MeridianIT](#)
- [Demo instance on Client Demo Center](#)
- [Partners access Software catalog](#)
- [Forum for support, ask us for help](#)

Developer Journeys

- [Counting cars](#)
- [Train models to detect flavors of Coke](#)
- [Classify Photo resist wafers](#)

Videos on YouTube

- [Train models for Classification and Object detection](#)
- [Train models for Advanced Driving Assistant Systems](#)
- [Continuous learning for data labeling](#)
- [Follow our channel on YouTube](#)



Agenda

Introduction – AI Trends & Challenges

PowerAI & PowerAI Enterprise (WML-A) & AC922 HW Introduction
Technology Differentiators, Accelerated Machine Learning

Private AI Solutions Overview based on PowerAI :

PowerAI Vision & Intelligent Video Analytics

Watson Studio, ICP4Data

h2O.ai Driverless AI

Appendices/Bonus:

AC922 details & pricing, PowerAI Public References

Demos & Illustrations:

AI with IBM Cloud Private w/ PowerAI, AI Vision, H2O.ai, Watson Studio (DSX) Local :

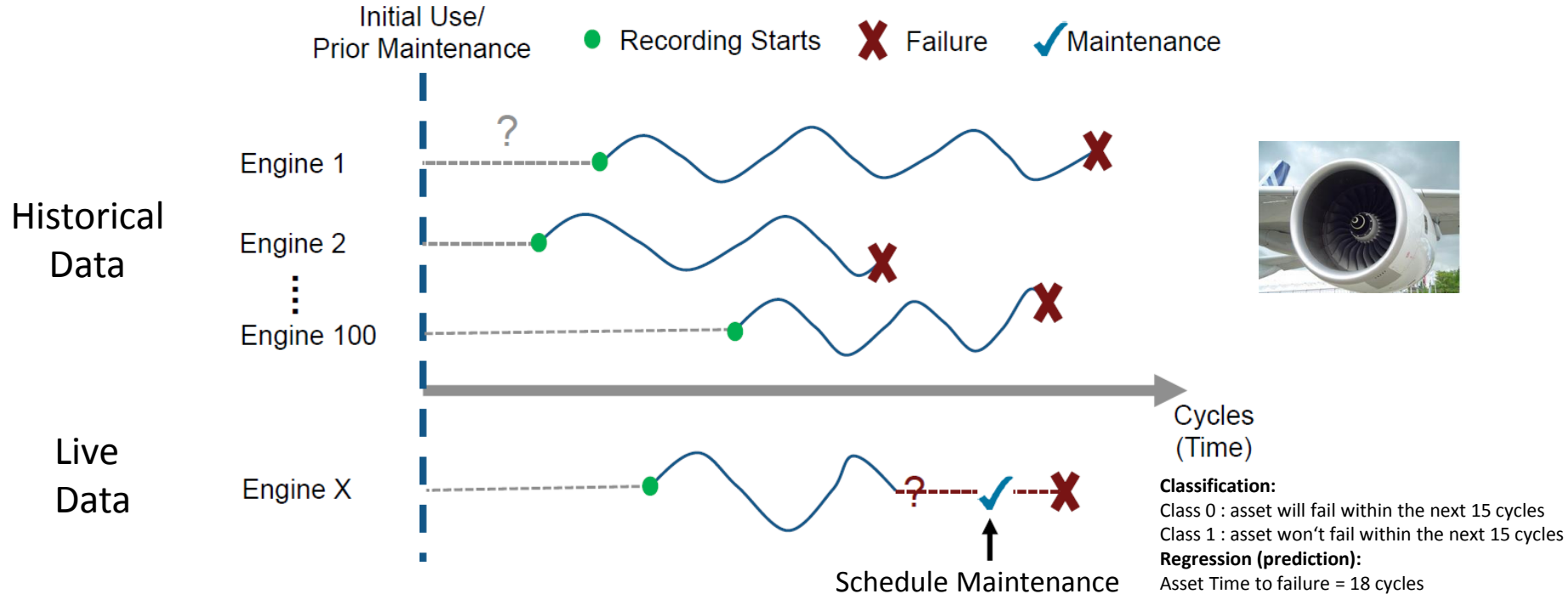
[H2O.ai Driverless AI quick demo](#) on ICP/POWER

[DSX & Predictive Maintenance Example](#)





Example: Predictive Maintenance



DSX Demo available <https://ibm.ent.box.com/v/power-iot-dsx-video-mp4>

Historical Data from NASA <https://ti.arc.nasa.gov/tech/dash/groups/pcoe/prognostic-data-repository/>

Get Started Today

PowerAI Developer Portal

<https://developer.ibm.com/linuxonpower/deep-learning-powerai/technology-previews/powerai-vision/>

AI Vision Object Detection **Demo**

<https://www.youtube.com/watch?v=19vaot75JCY>

https://github.com/IBM/powerai-counting-cars/blob/master/notebooks/counting_cars.ipynb

AI Vision / Public Cloud – Get Started **demo**

<https://github.com/IBM/powerai-vision-object-detection>

PowerAI **FAQ**

<https://developer.ibm.com/linuxonpower/deep-learning-powerai/faq/>

PowerAI 1.5.3 on IBM Cloud **Free trial**

<https://console.bluemix.net/catalog/services/powerai>

PowerAI Vision 1.1.1 **Free trial**

[Register for a free 3-day trial of PowerAI Vision](#)

Power-Up your journey to **AI**
with IBM **Cognitive Systems Lab**
Montpellier



Get Started Today with Machine & Deep Learning PoC/Support /Enablement/Workshops...

Engage us



[Alain Roy](#)

Cognitive Systems Lab Engagement Leader
IBM Client Center Montpellier
a2roy@fr.ibm.com



[Philippe Chonavel](#)

Cognitive Systems Lab Manager
IBM Client Center Montpellier
p_chonavel@fr.ibm.com

1. Build a Data Science Team
Your Developers Can Learn
<http://cognitiveclass.ai>
2. Identify a Low Hanging Use Case
3. Figure Out Data Strategy
4. Consider Pre-Built AI APIs
- 5. Contact Us**
6. Get Started Today at
www.ibm.biz/poweraideveloper

IBM PowerAI

Deep Learning and PowerAI Development

Develop the next generation of applications

Get started

Others Using Deep Learning on Power

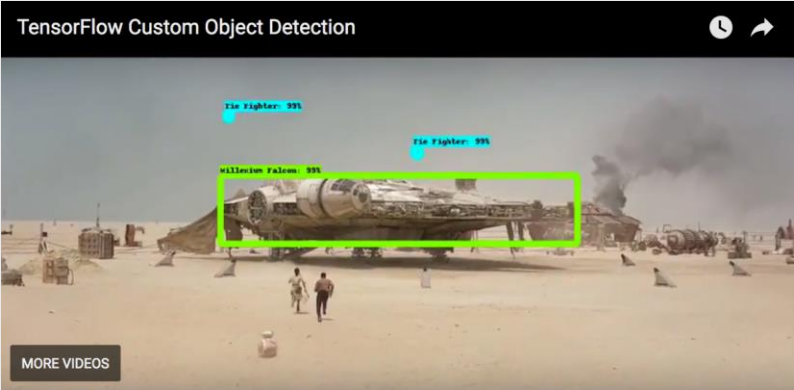
Deep Learning Developer Education

PowerAI for Developers

PowerAI Releases

Technology Previews

Try PowerAI



Welcome to IBM PowerAI Trial

Get started or get scaling, faster, with a software distribution for machine learning running on the Enterprise Platform for AI: IBM Power Systems.

To access your IBM PowerAI Trial

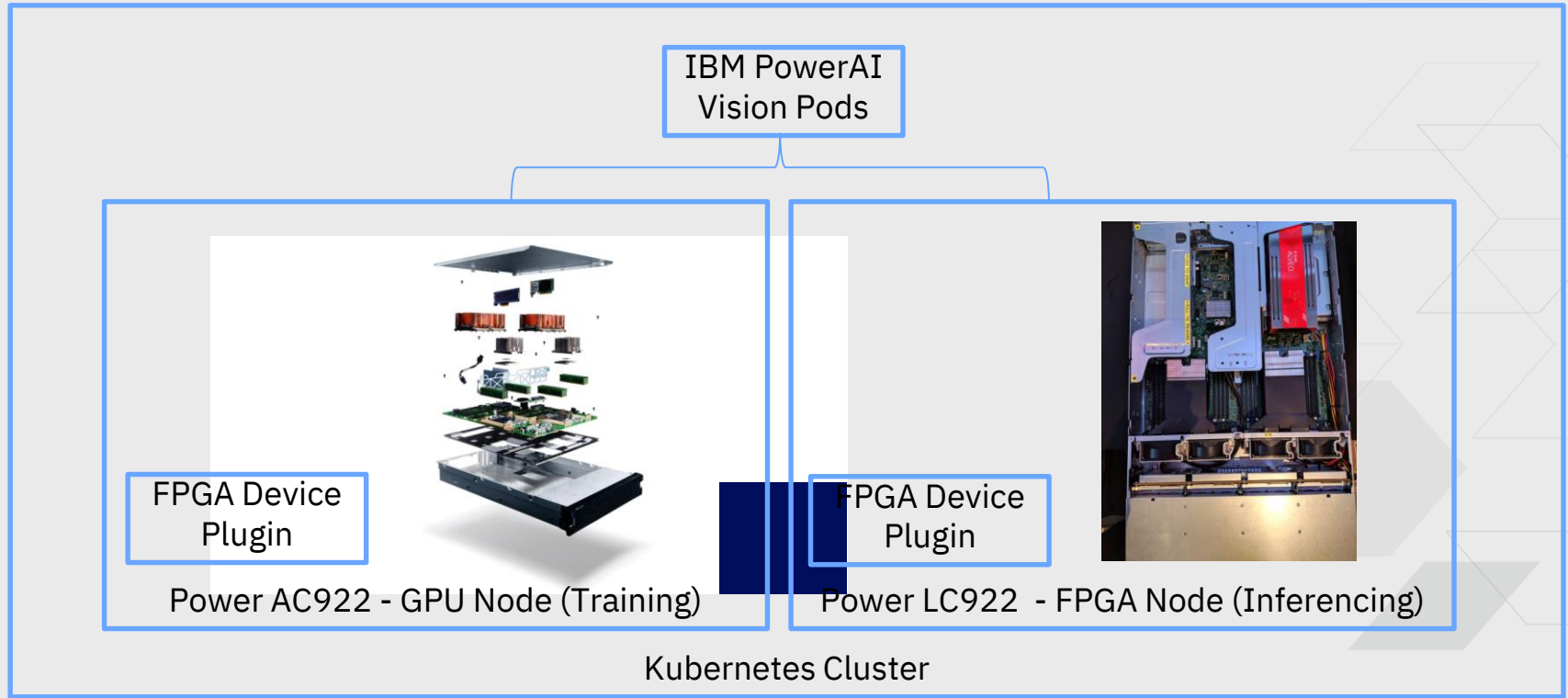
1. Please issue the following command: `ssh -L 8888:localhost:8888 nimbox@[IP Address]`
2. Enter your password when prompted
3. On your local browser, visit the following URL to get started: <http://localhost:8888/tree/>

IBM PowerAI Trial Summary

User Id	IP Address	Password	Subscription Id	Start date	Expiration date
nimbix			502385381	Tuesday, October 17, 2017	Wednesday, October 18, 2017

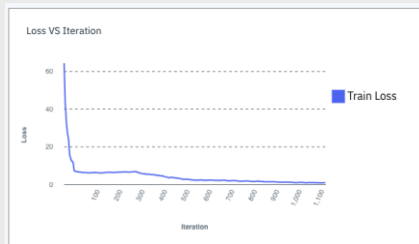
Backup

Kubernetes Cluster



Integration with Xilinx MLSuite

Train YOLO



Deploy

MYDOG_MODEL

Deploy Model

Deployed model name:

MyDog_model

Deploy to accelerator:

Xilinx FPGA - 16 bit

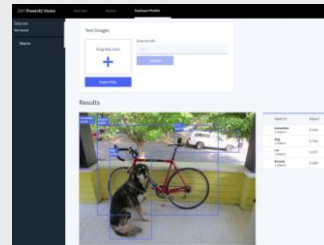
Xilinx FPGA - 8 bit

Xilinx FPGA - 16 bit

Schedule
Available FPGA



Run Inference



Inference Container

{ REST API }

Deploy.py

GPU or FPGA?

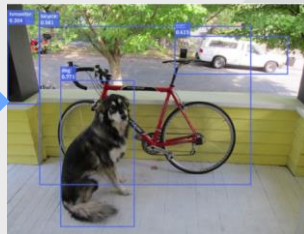
xDNN Compile
& Quantize (if needed)

xDNN Runtime

Caffe Prototxt,
Weights, & Anchors

Sample Training
Images

```
{webAPIId: "bf1c53fa-b931-4697-9ef7-985137b2e080",...}
  classified: [,...]
    0: {confidence: 0.304, ymax: 246, label: "tvmonitor", image_id: "image."}
    1: {confidence: 0.771, ymax: 549, label: "dog", image_id: "image.png",
        confidence: 0.771
        image_id: "image.png"
        label: "dog"
        xmax: 314
        xmin: 132
        ymax: 549
        ymin: 188}
    2: {confidence: 0.615, ymax: 172, label: "car", image_id: "image.png",
        3: {confidence: 0.581, ymax: 445, label: "bicycle", image_id: "image.png",
        imageUrl: "https://github.com/pjreddie/darknet/raw/master/data/dog.jpg"
        result: "success"
        webAPIId: "bf1c53fa-b931-4697-9ef7-985137b2e080"}
```



2017

POWER9 (SO)



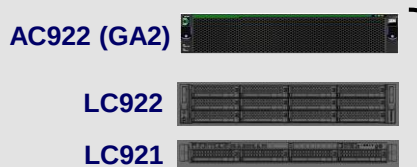
7965-S42 Rack



4Q

2018

POWER9 (SO & SU)



1Q

2Q

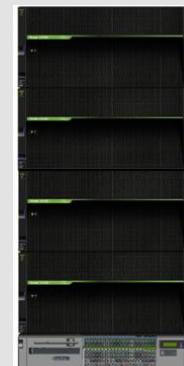
E980



E950



E980



3Q

4Q

Power Systems Product Portfolio

POWER9 servers and solutions are built to crush today's most advanced data applications ...
from the mission critical applications you run today to the next generation of AI workloads

Mission Critical Workloads

Entry

Mid

Enterprise

S922/S914/S924
H922/H924/L922
Q1 2018

E950/H950
Q3 2018

E980/H980
Q3 2018

Big Data Workloads

LC922/LC921
Q2 2018

Enterprise AI Workloads

AC922
Q4 2017

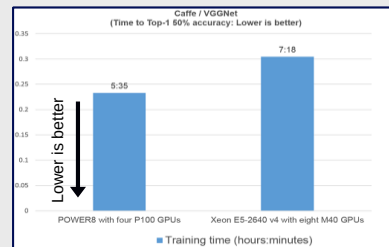
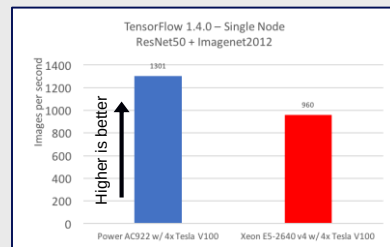
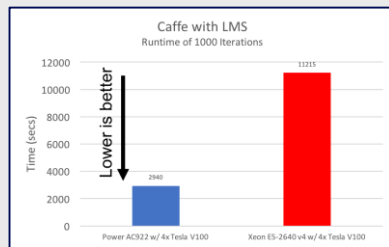
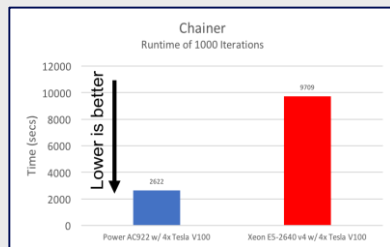


Core Infrastructure

Next Gen AI Workloads

Faster training times than x86¹

- **3.7x** faster running Chainer²
- **3.8x** faster running Caffe³
- **2.3x** faster running TensorFlow⁴ and **35%** more images per second⁵
- Four (4) GPUs on Power is faster than eight (8) GPUs on Intel⁶



Extended references in notes section [1]

<https://developer.ibm.com/linuxonpower/perfcol/perfcol-mld/>

Public References

PowerAI client examples: using deep learning for better outcomes



- Fraud and crime prevention for Automated Tellers, facial recognition
- Detects attempts to disguise, or hide facial features



- Manufacturing process inspection for hot steel rolling
- Reducing defects through early detection



- Technology incubator for AI in healthcare
- Increase diagnostic accuracy, reduce examination time



- Reducing credit approval turn around time, while at the same time decreasing potential risk of default
- Improved personalization for customer offers: next offer, next best offer

PowerAI client examples: using deep learning for better outcomes



- Personalized quotes based on vehicle inspection and insurance certificates
- Minimize lead time for insurance quotes and limit lost sales opportunities



- New video analytics model assembles “trailer” for TV program
- From 30 days down to a day



- Natural language and data pattern analysis for e-discovery
- Quickly respond and adapt to privacy/right to be forgotten requests



- Deep learning model improves accuracy of real-time bio simulations
- View accurate rendering of a patient’s heart before the procedure

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256GB RAM

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