

# Deep Learning for NAS

## Real-time Hazard Precursor Identification

Presented to: ATIEC 2016

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Date: September 21, 2016

*Aviation Information World - Forecasting the Future*

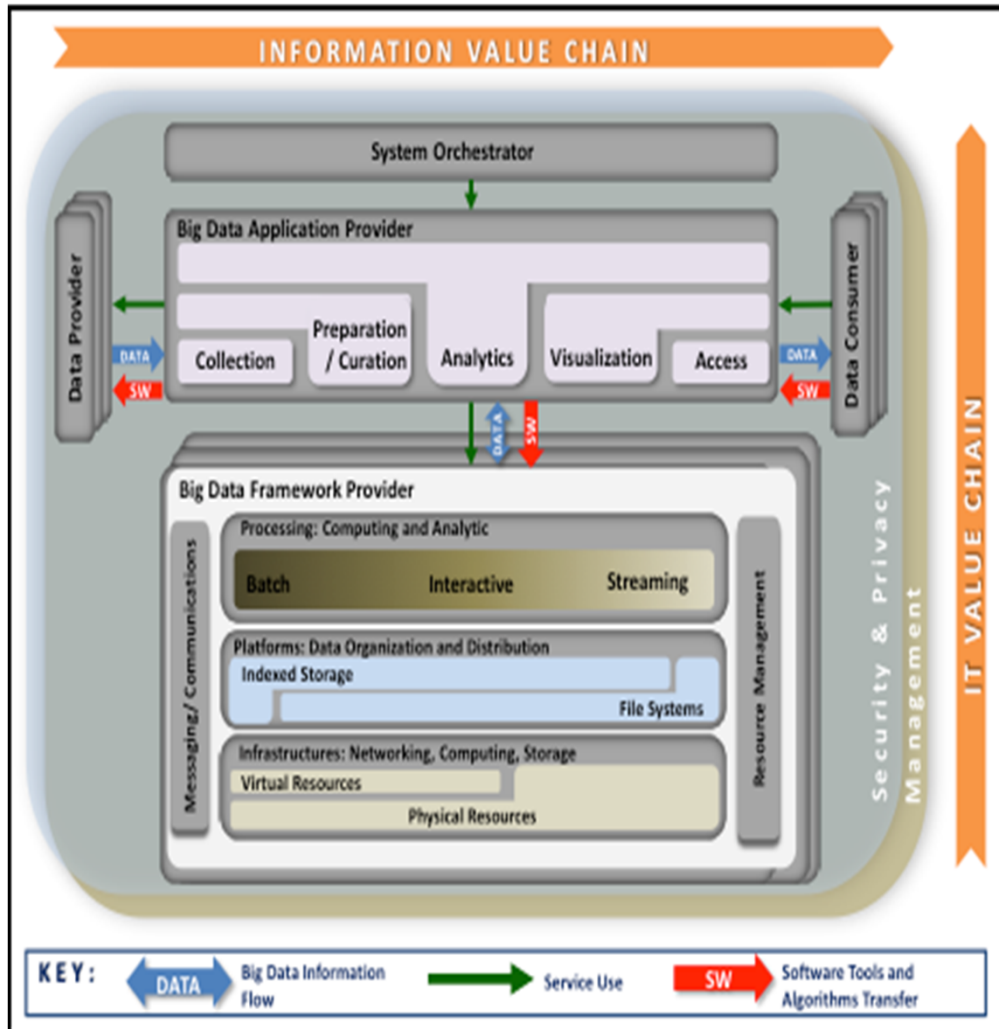


# Deep Learning for NAS

- **Big Data**
- **Data Science**
- **Big Data Analytics Trends**
- **Deep Learning Technique**
- **NAS Application**



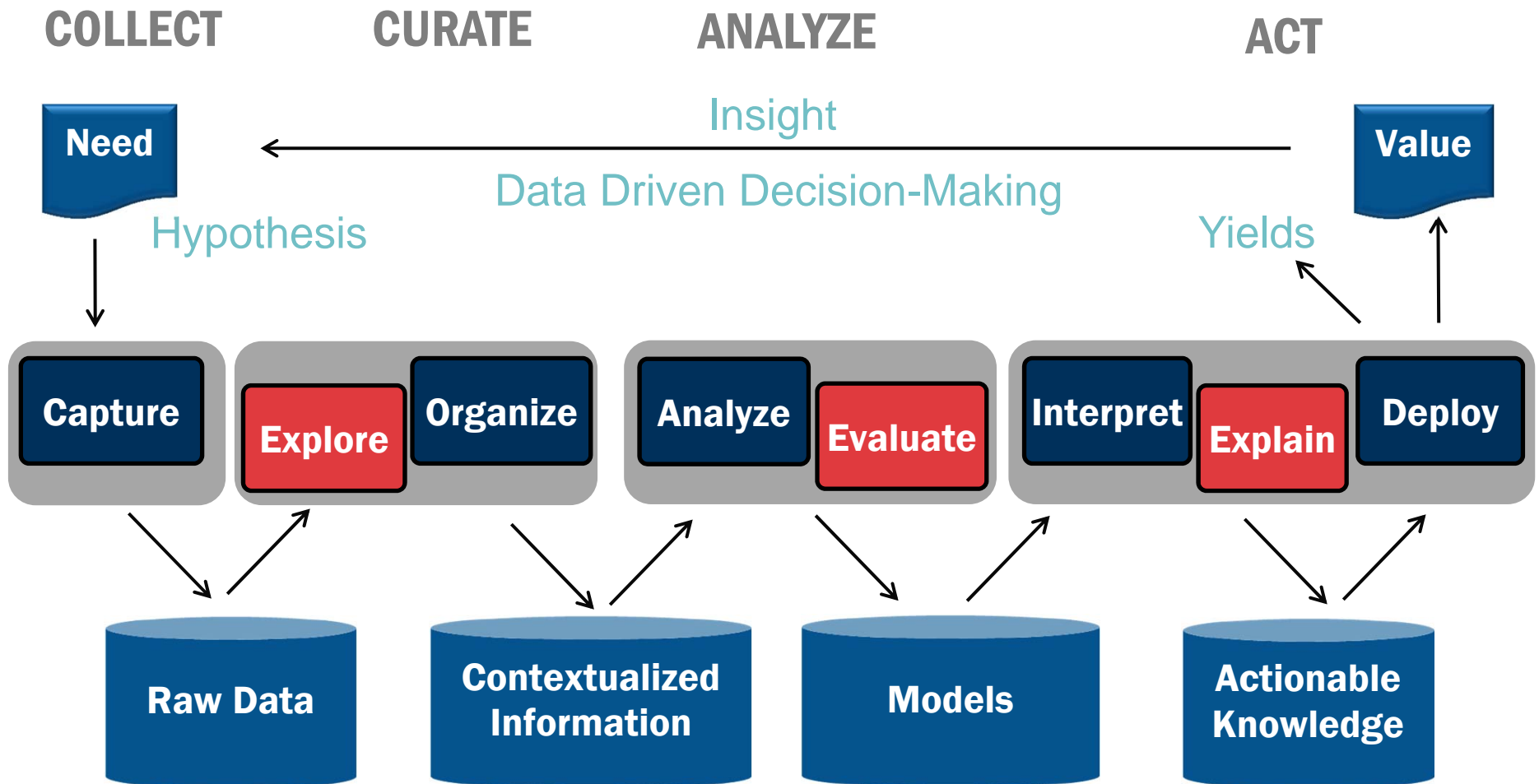
# NIST Big Data Reference Architecture



*Big Data* consists of extensive datasets that require a scalable architecture for efficient storage, manipulation, and analysis.

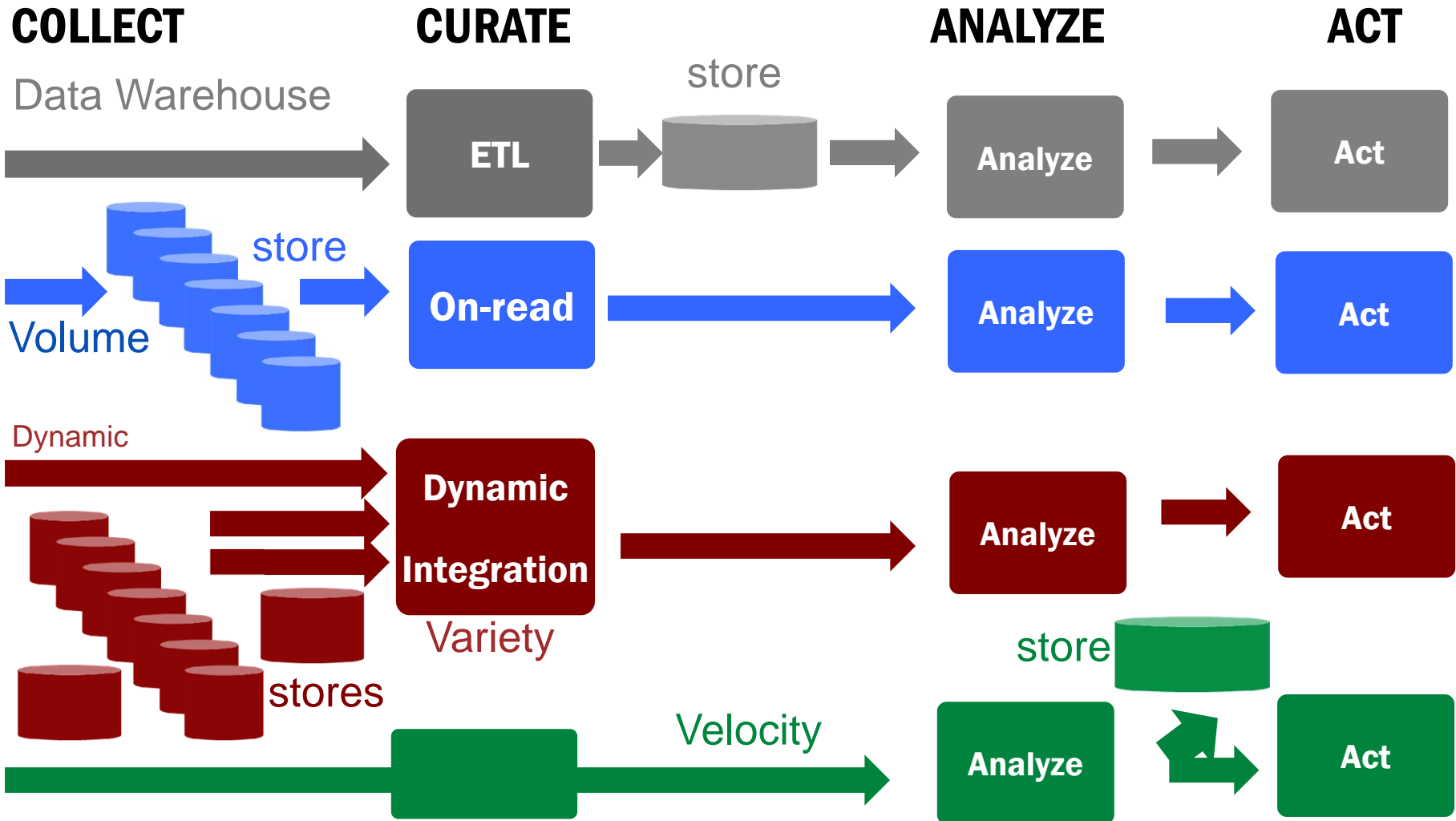
<https://www.nist.gov/el/cyber-physical-systems/big-data-pwg>

# Application Layer—Data Science





# Why only 3 V's



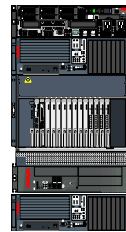
# Now: Internet of Things

## Multi-tiered Architecture

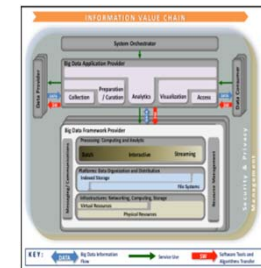
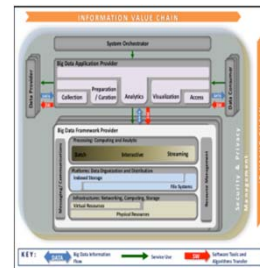
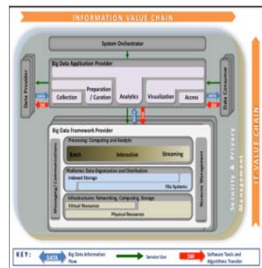
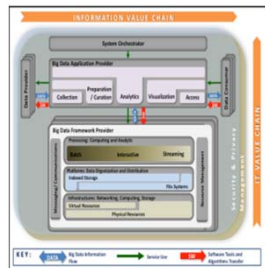
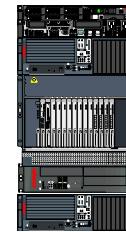
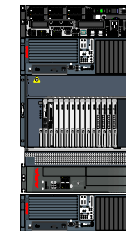
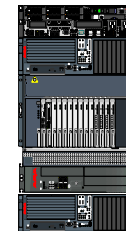
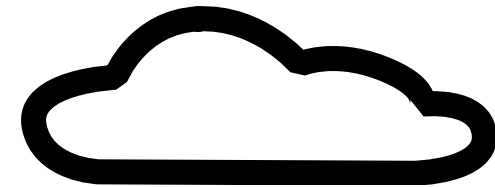
### Sensors



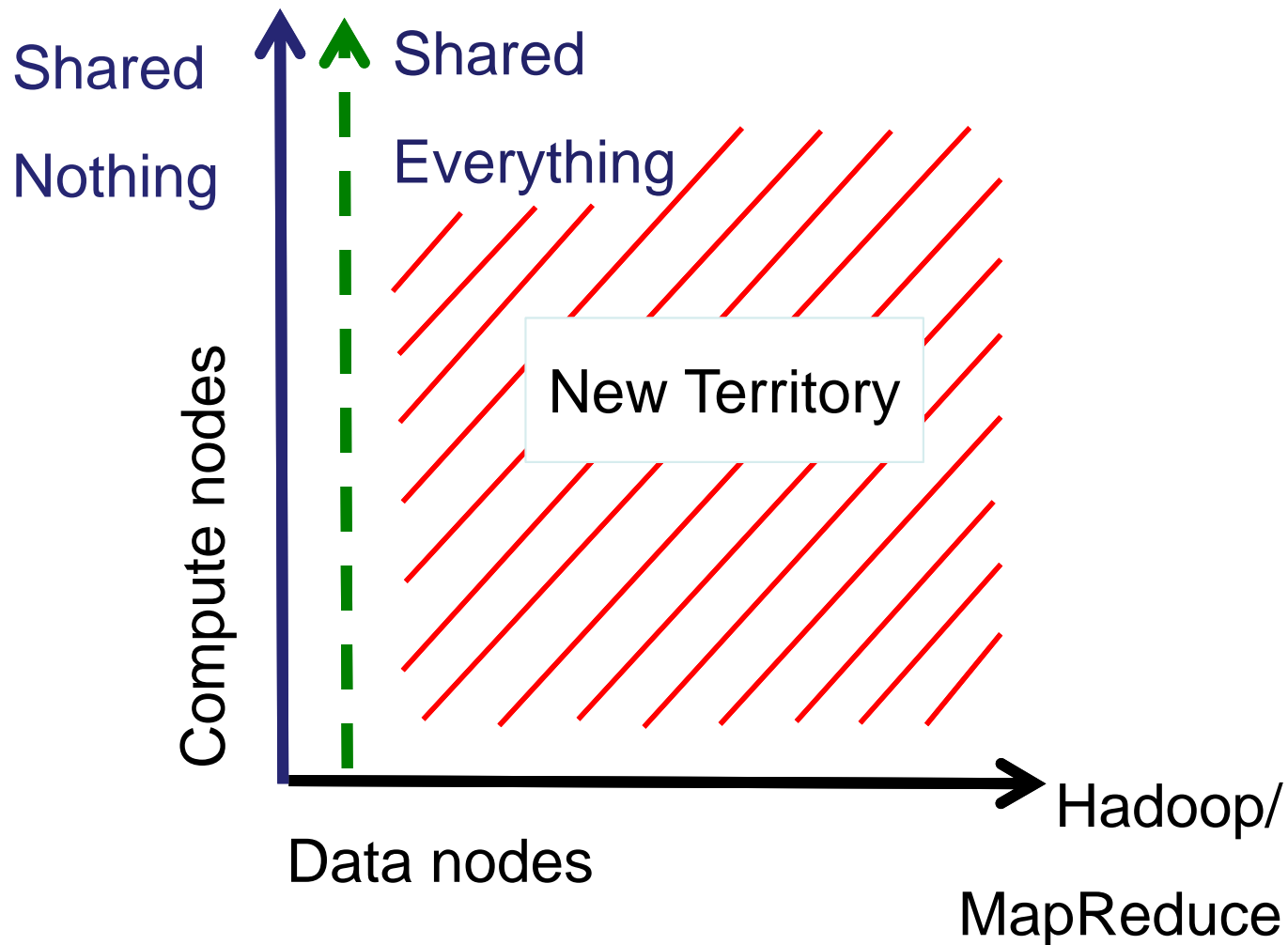
### Fog/Local Fabric/Regional



### Data Lake/National



# View: Compute vs. Data Intensive



# New Computing Trends

Compute-intensive parallel computing

Data-intensive parallel computing

Data Centers and Data Lakes

CPU and GPU

Data Mining and Data Science

Network for sharing vs. distributed computing

Distributed Analytics

Cloud and Micro-services

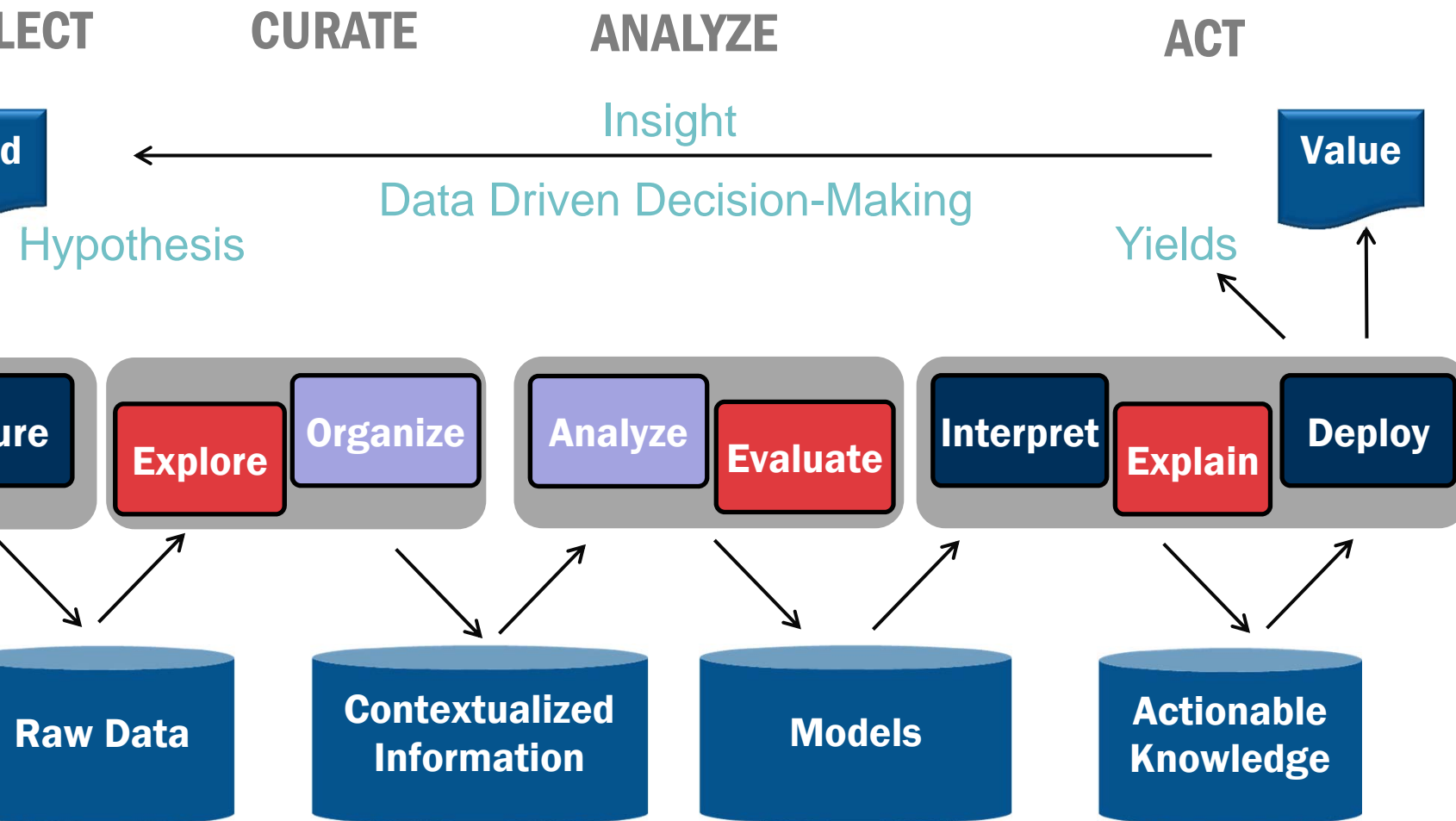
Network Effect





# Modeling Implication

## Feature Extraction and Analysis



# Auto-Feature-Extraction Analysis

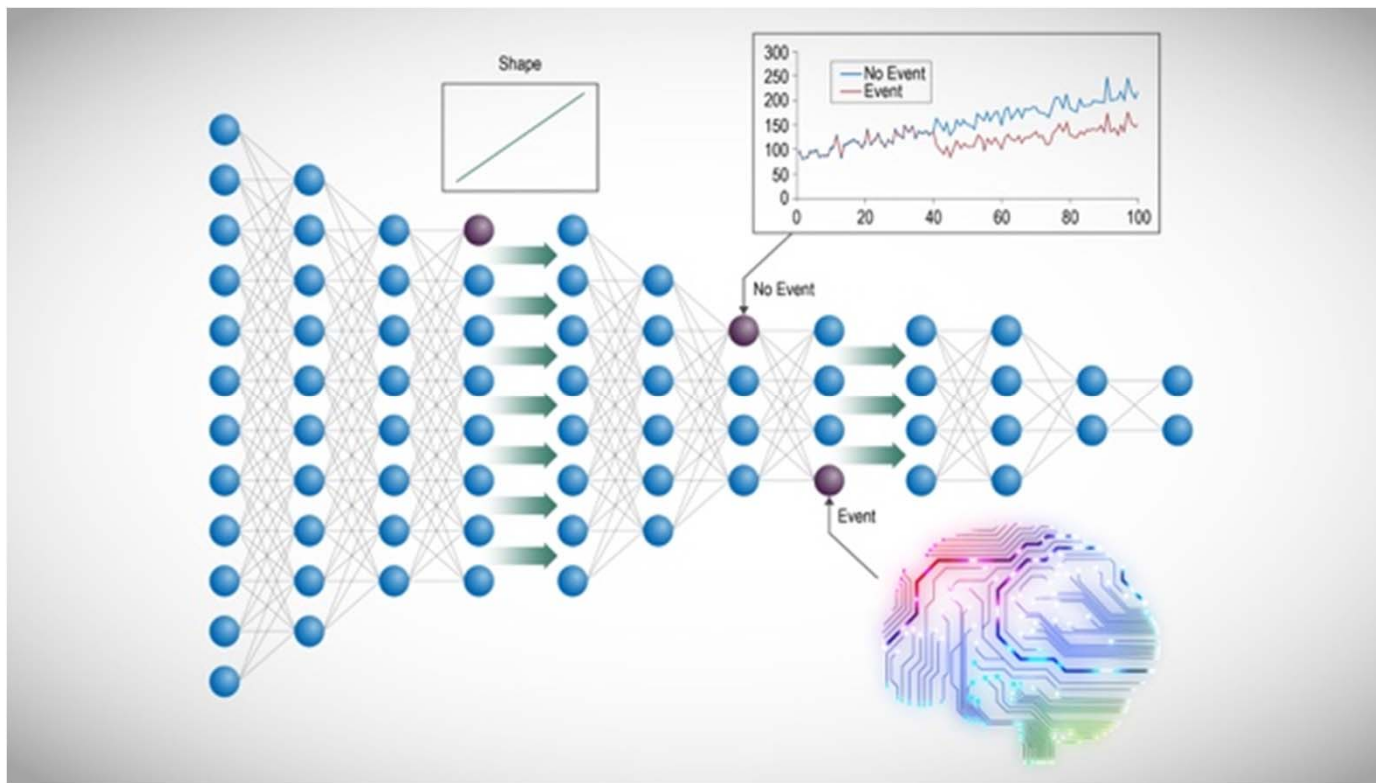
**Involves direct learning from data**

**Unsupervised for automated feature extraction**

**Combines supervised and unsupervised**



# Take a Cue From Neurobiology

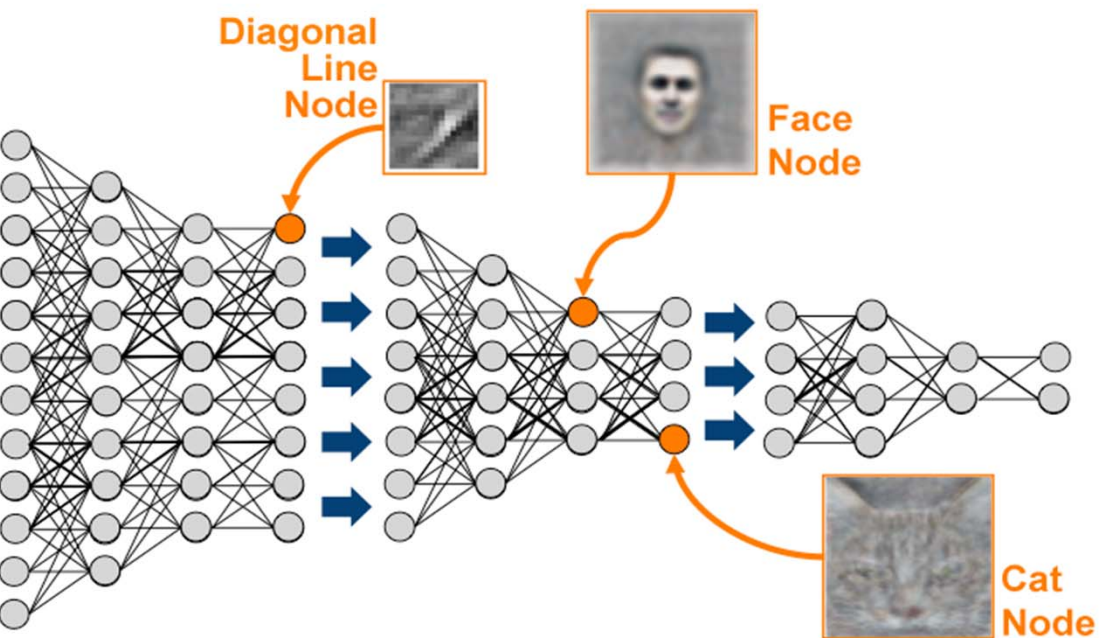


Mimic the Brain

# Deep Learning

Deep Learning gained popularity in 2007

A branch of machine learning based on a set of algorithms that attempt to model high-level abstractions in data by using a deep graph with multiple processing layers



- **Since 1980**
- **GPU computing**
- **Distributed computing**
- **Distributed memory**
- **Large-scale storage**

•Google's deep network that automatically created image filters for recognizing faces and cats.





# 's Not Your Father's Neural Network

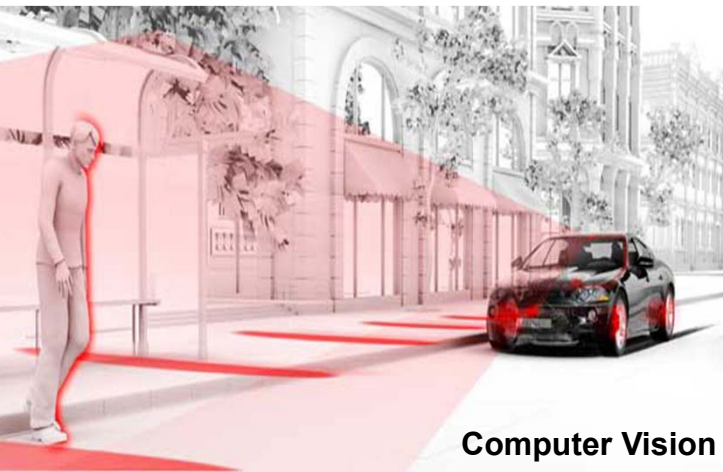


Object Recognition



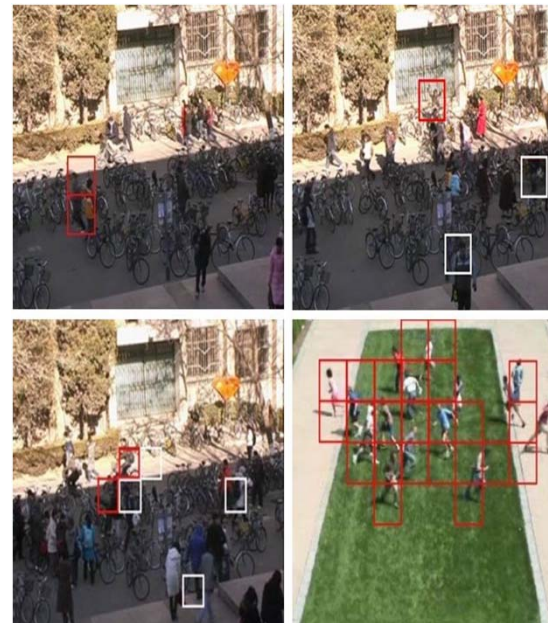
Object Classification

Language Translation



Computer Vision

Anomaly Detection





# Deep Learning for NAS

## Sensor Analytics

- Failure prediction

## Trajectory Analysis

- Identification of hazard features



# Component Failure Prediction

## Sensor data from component

- Past data where failures have occurred
- Currently running data

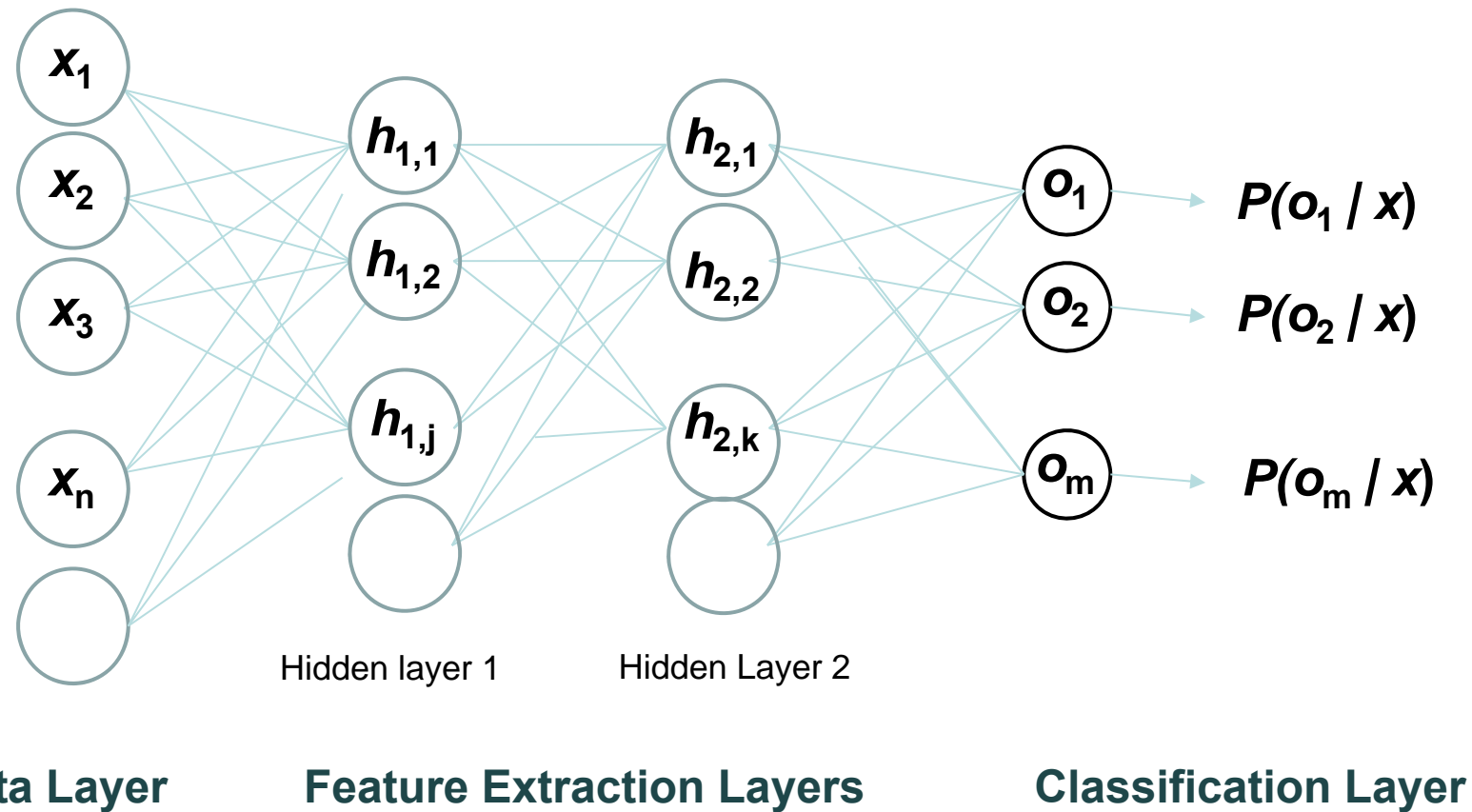
## Model learns from past data

- Features
- Relationships between features and fault classification



# Component Failure Prediction

## Deep Learning Use Case



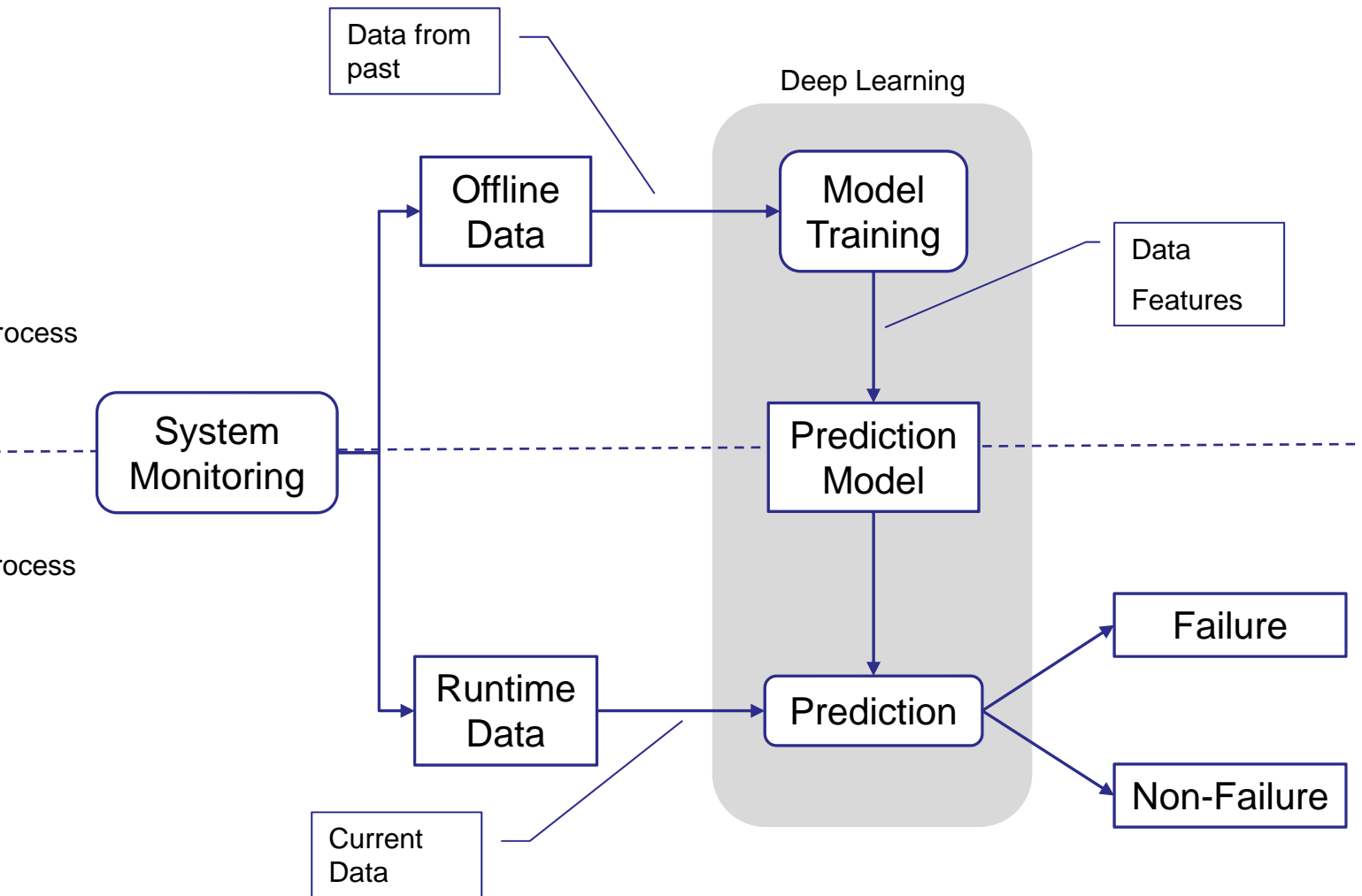
Input Layer

Feature Extraction Layers

Classification Layer



# Component Failure Prediction



# Types of Deep Learning

## From Neural Network Origins

- Torch, Theano, Caffe
- Supervised and/or unsupervised

## From Neurological Origins

- Numenta Hierarchical Temporal Memory
- Continual Learning





# **uPIC Approach**

**umenta Platform for Intelligent Computing**

- Continuous online learning**
- Temporal and spatial patterns**
- Real-time streaming data**
- Prediction and modeling**
- Anomaly detection**
- Hierarchical temporal memory**

<http://numenta.com/biological-and-machine-intelligence/>



# Use Case: Trajectory Anomalies

## PIC HTM

Learning directly from observations

Neuroscience-based pattern recognition

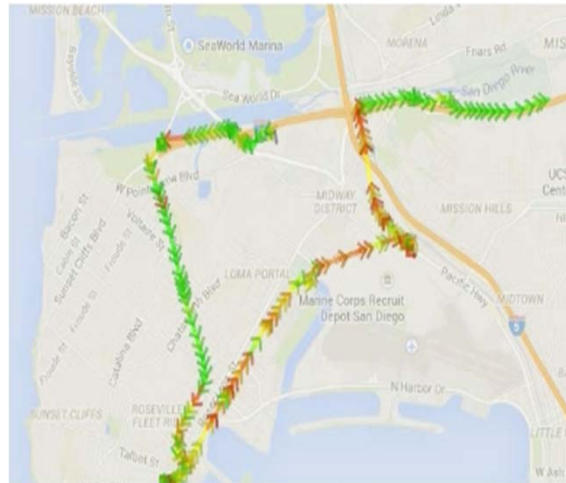
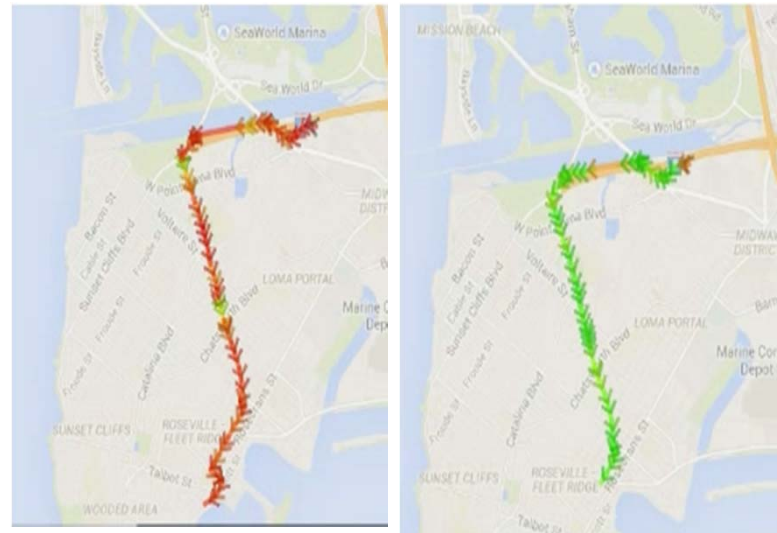
- Learning, as the brain learns
- Good for pattern recognition

Continuous learning

- Not constrained to train-test-live
- Accommodates drift

Anomaly detection

- In space and time



# ummary

**Separation of model-building and model-scoring**

**Competition between data sharing and sharing analytics results**

**Alternate method for learning from data**

– Without feature extraction

**Competition between physics-based models and unsupervised learning**



# Questions/Comments?

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