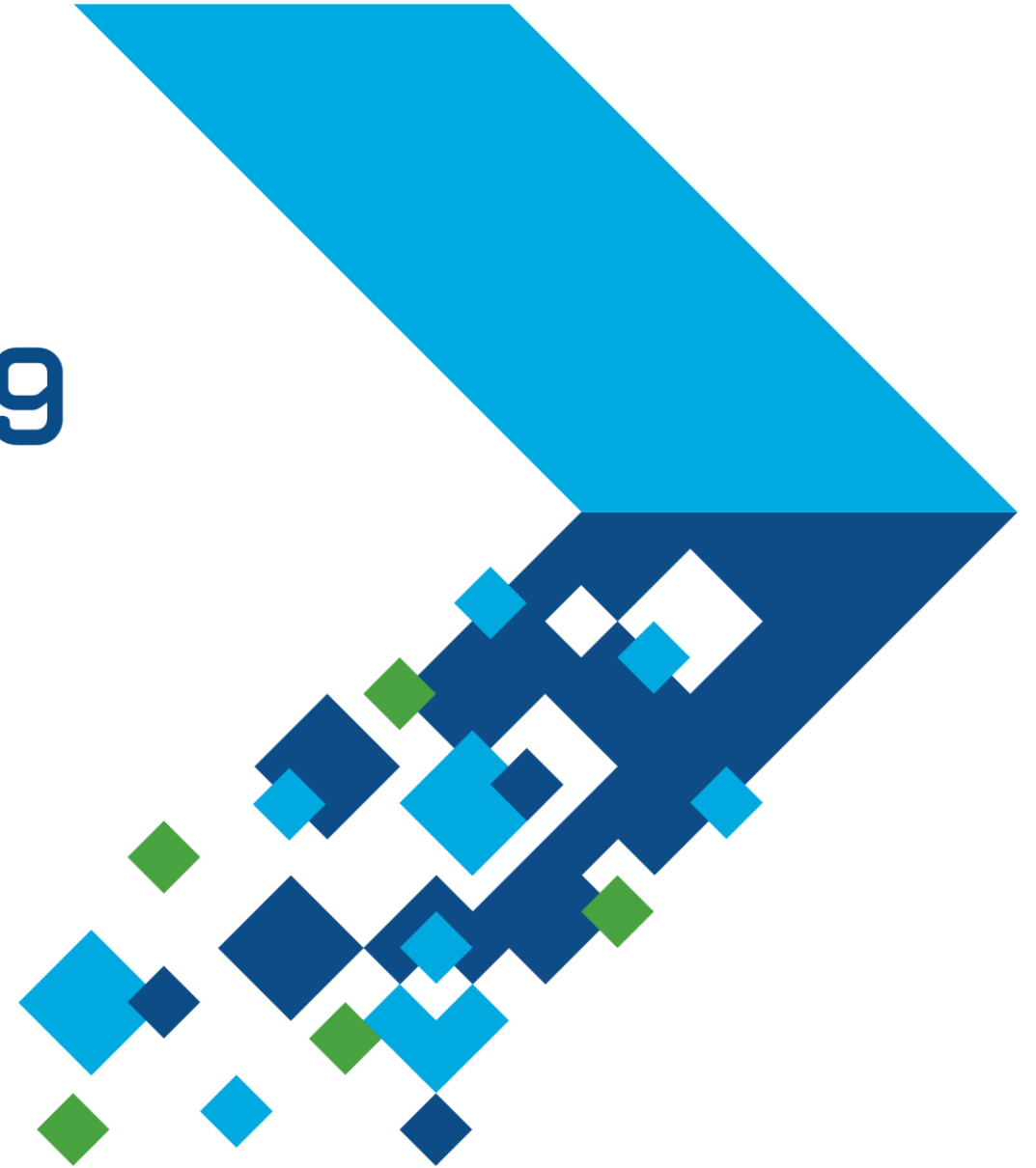


# MATLAB EXPO 2019

## Deep Learning and Reinforcement Learning Workflows in AI

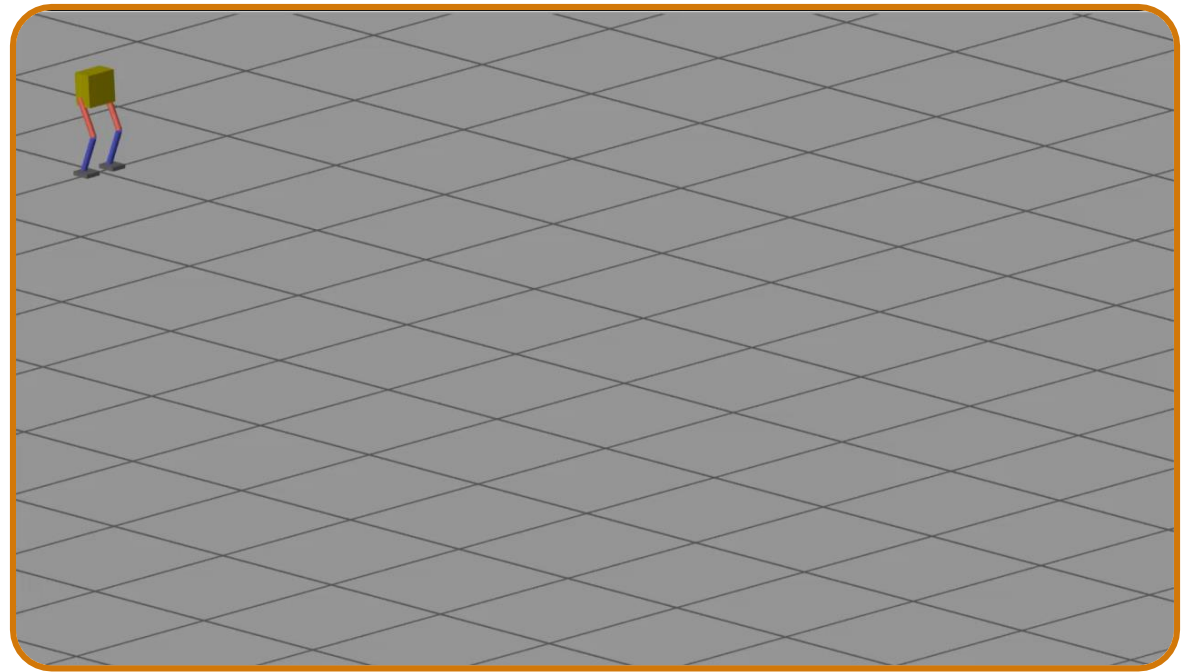
Valerie Leung



# Why MATLAB for Artificial Intelligence?

# Artificial Intelligence

Development of computer programs to perform tasks that normally require human intelligence



# AI Applications



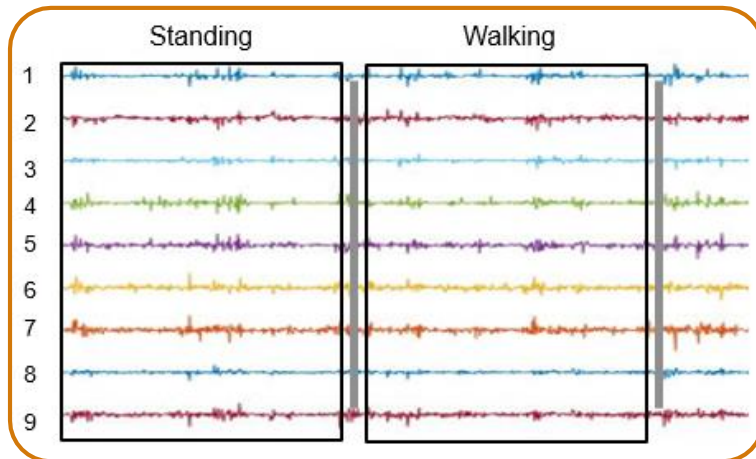
*Object Classification*



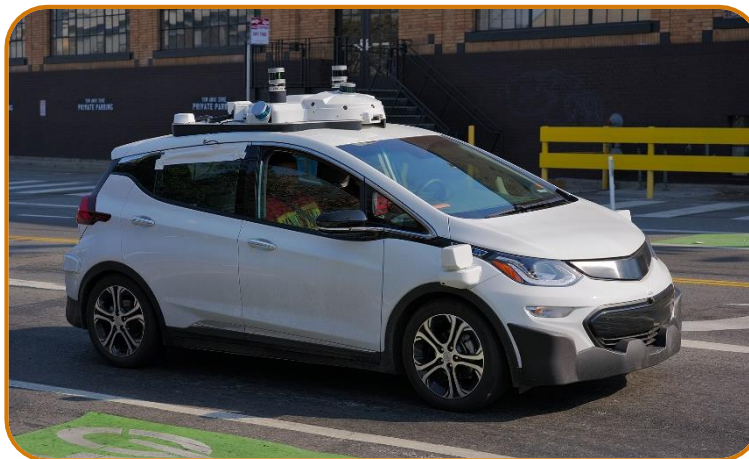
*Speech Recognition*



*Predictive Maintenance*



*Signal Classification*

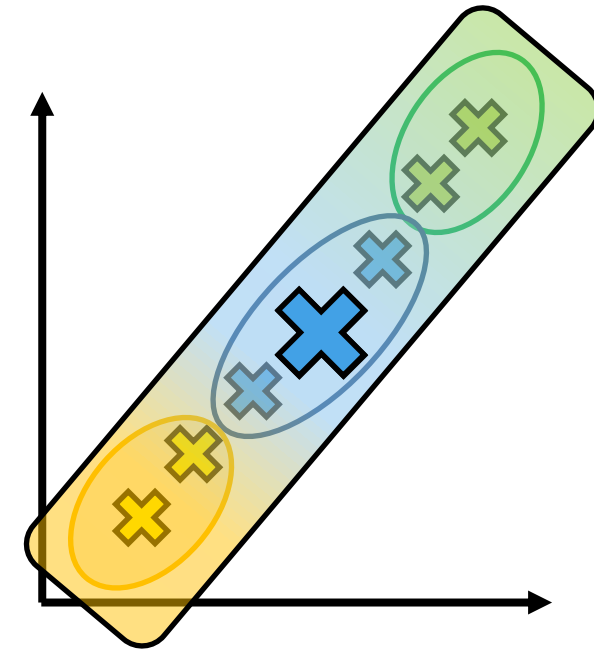
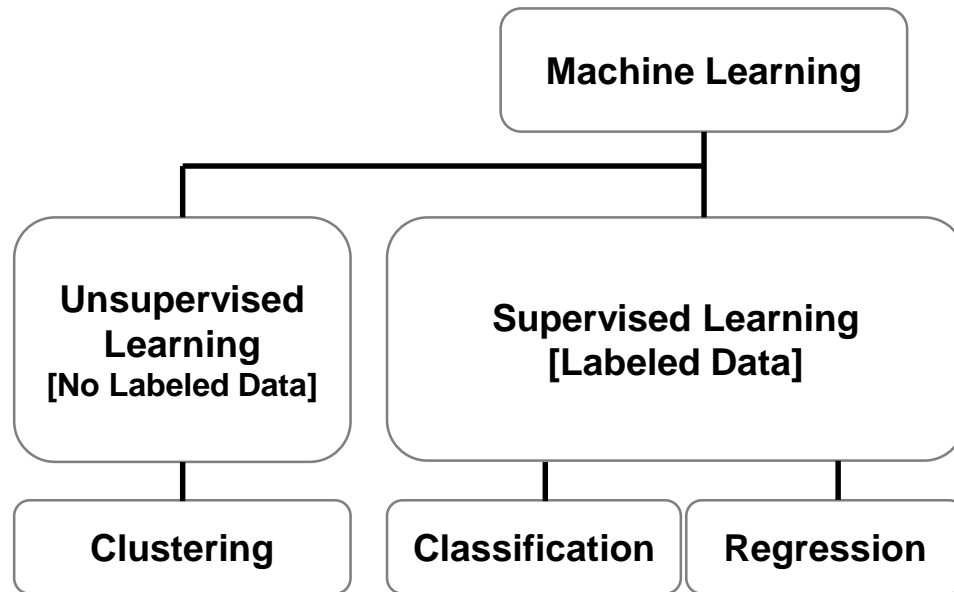


*Automated Driving*

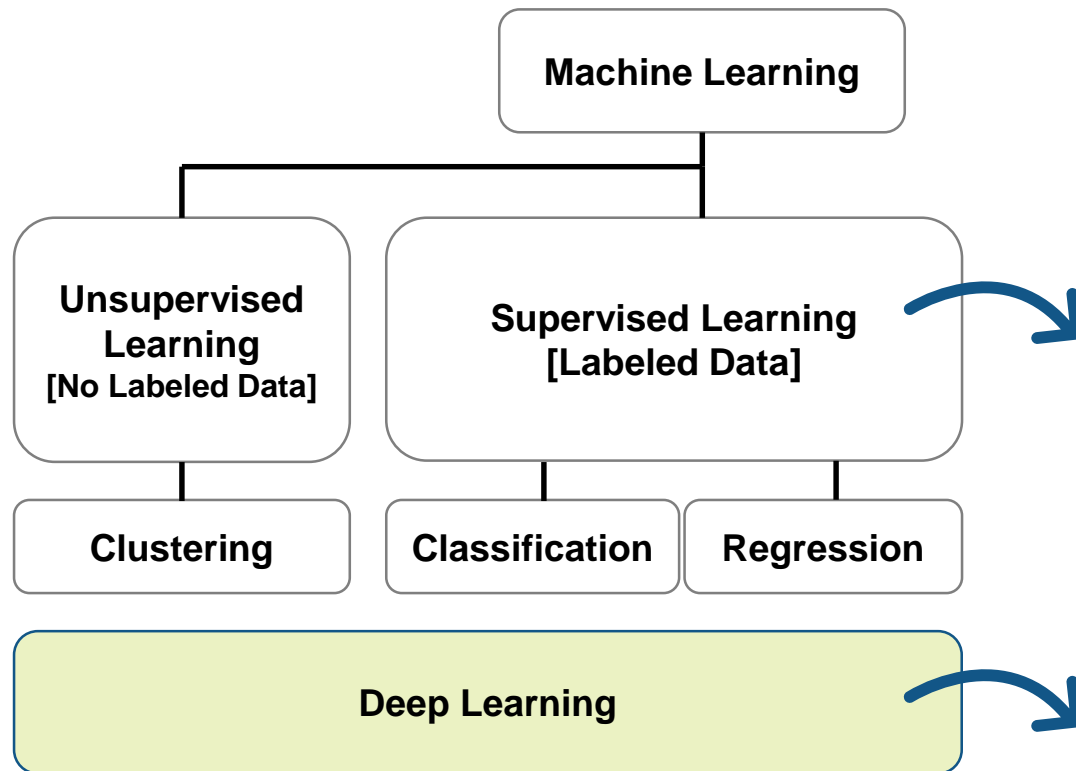


*Stock Market Prediction*

# Machine Learning and Deep Learning



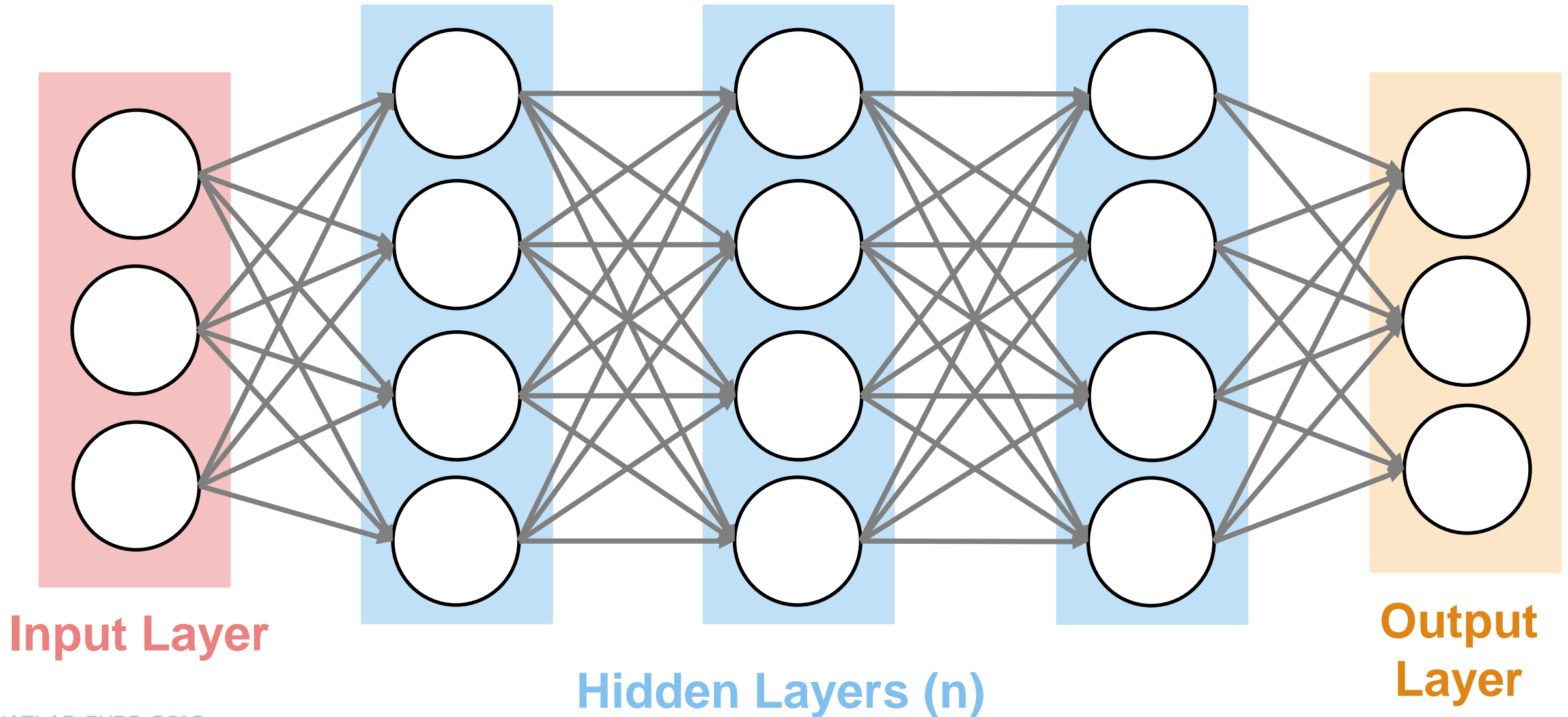
# Machine Learning and Deep Learning



Machine learning typically involves  
feature extraction

Deep learning typically does not  
involve feature extraction

# Deep Learning Uses a Neural Network Architecture





# Deep Learning Datatypes

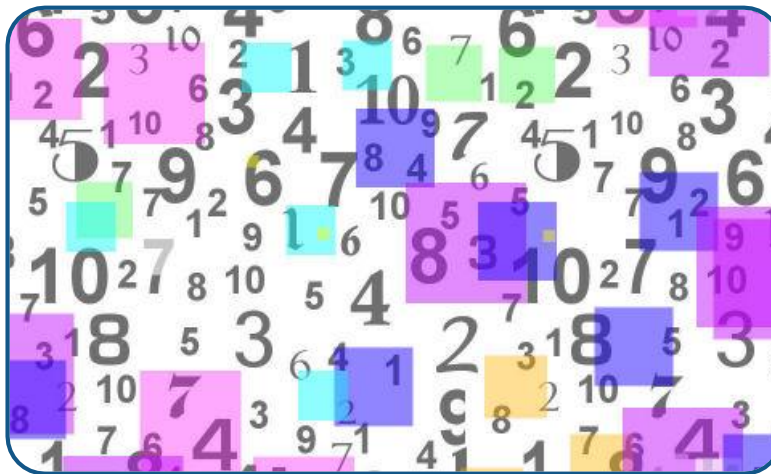
# Image



# Signal



# Numeric



# Text





# Deep Learning Workflow

## Prepare Data



Data access and preprocessing



Ground truth labeling

## Train Model



Model design, hyperparameter tuning



Model exchange across frameworks



Hardware-accelerated training

## Deploy



Multiplatform code generation (CPU, GPU)



Edge deployment



Enterprise deployment

# Why MATLAB for AI Tasks?

**Increased productivity with interactive tools**

**Generate simulation data for complex models and systems**

**Ease of deployment and scaling to various platforms**

---

**Full AI workflows that cannot be easily replicated by other toolchains**

# Why MATLAB for AI Tasks?

**Increased productivity with interactive tools**

**Labeling**

**Training**

**Model  
Exchange**

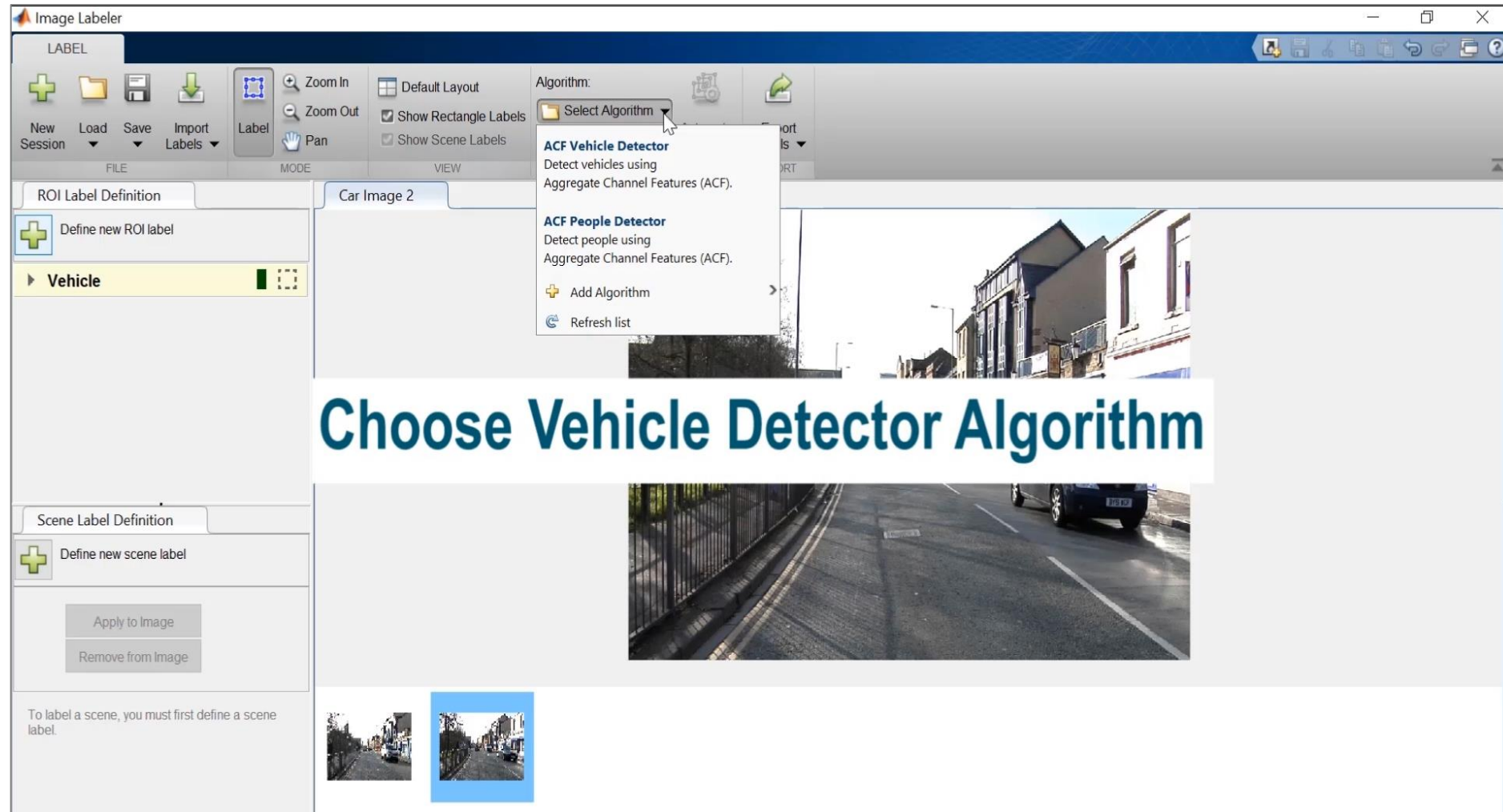
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**Full AI workflows that cannot be easily  
replicated by other toolchains**

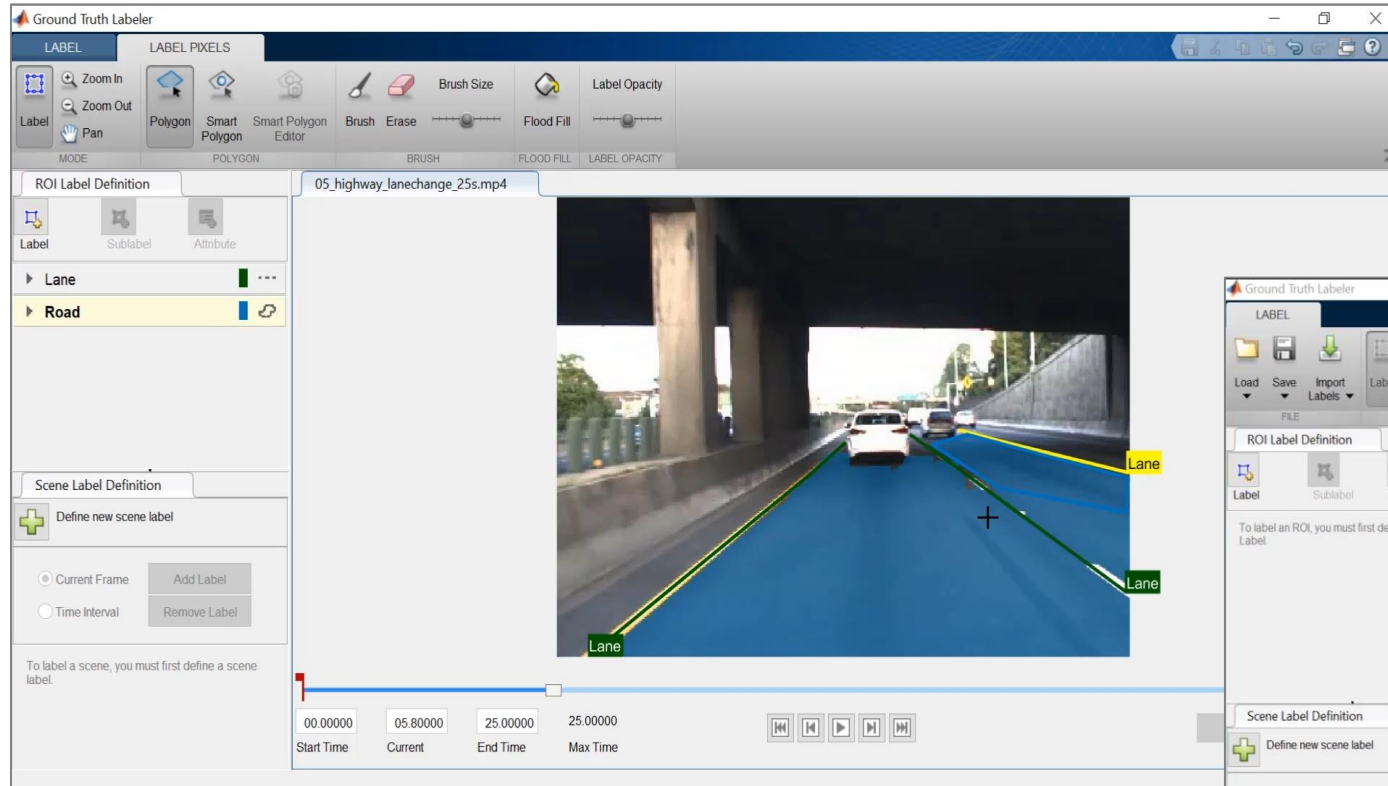
**Labeling for deep learning is repetitive,  
tedious, and time-consuming...**

**but necessary**

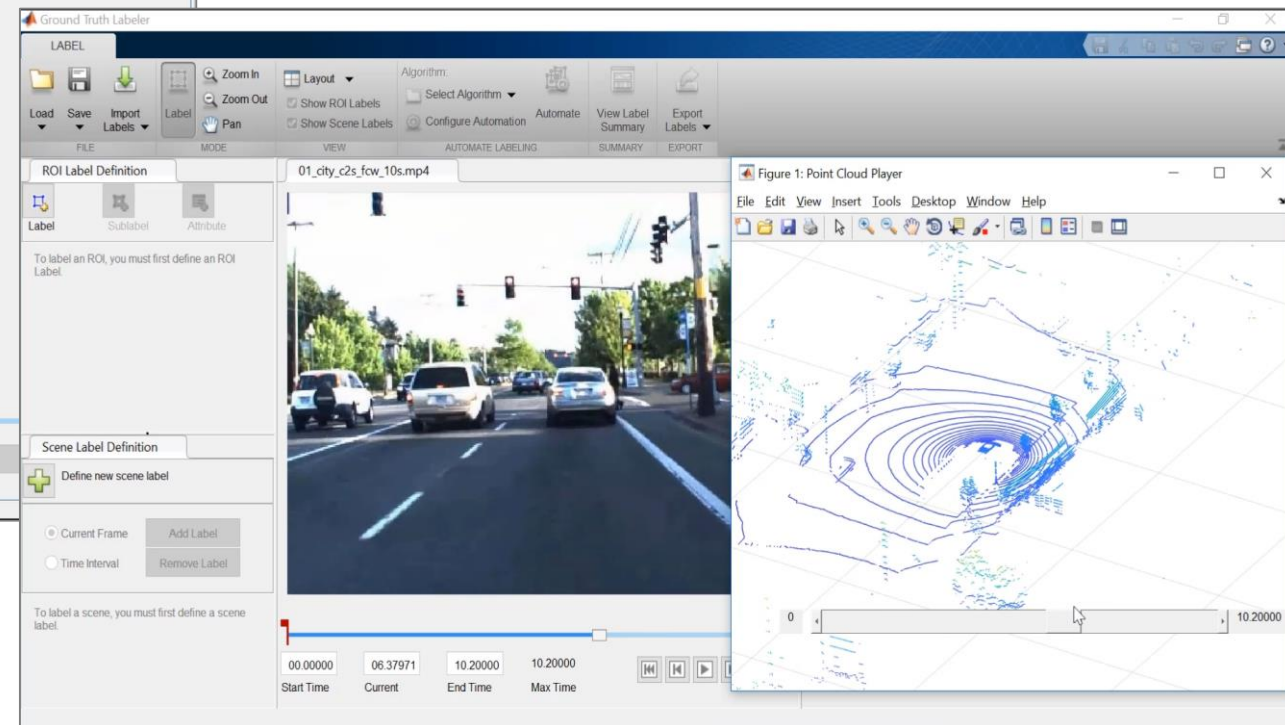
# Partially automate ground truth labeling with Apps



# Partially automate ground truth labeling with Apps

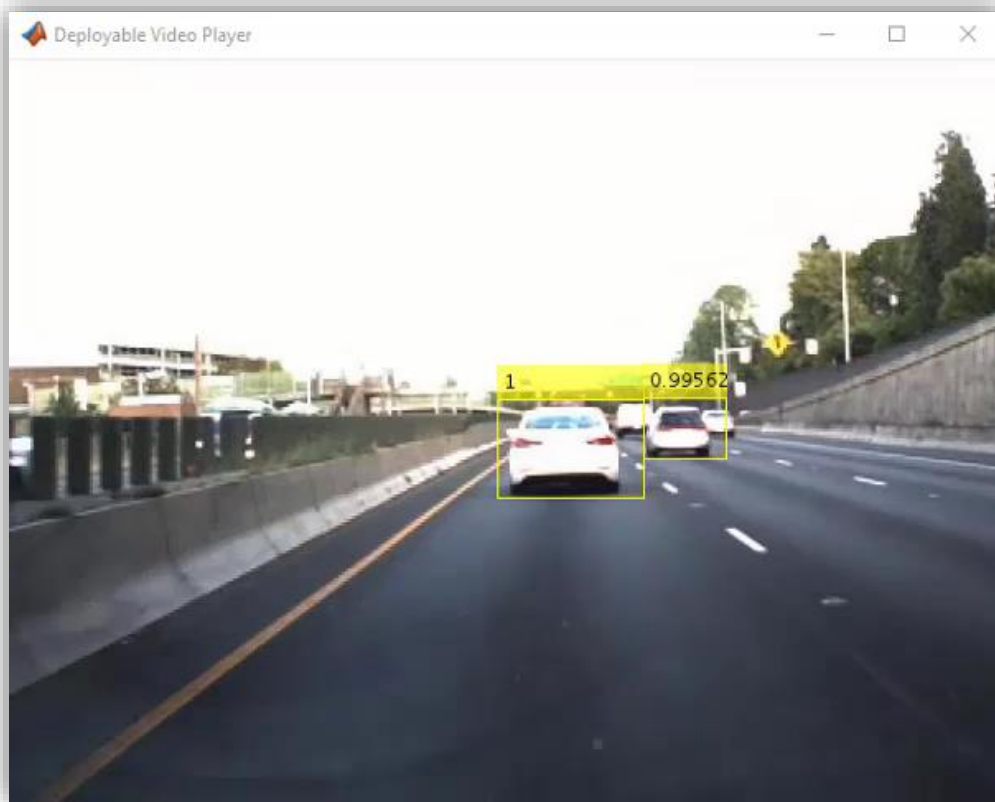


App for ground truth labeling dedicated to automotive applications





# Applications developed using labeled data

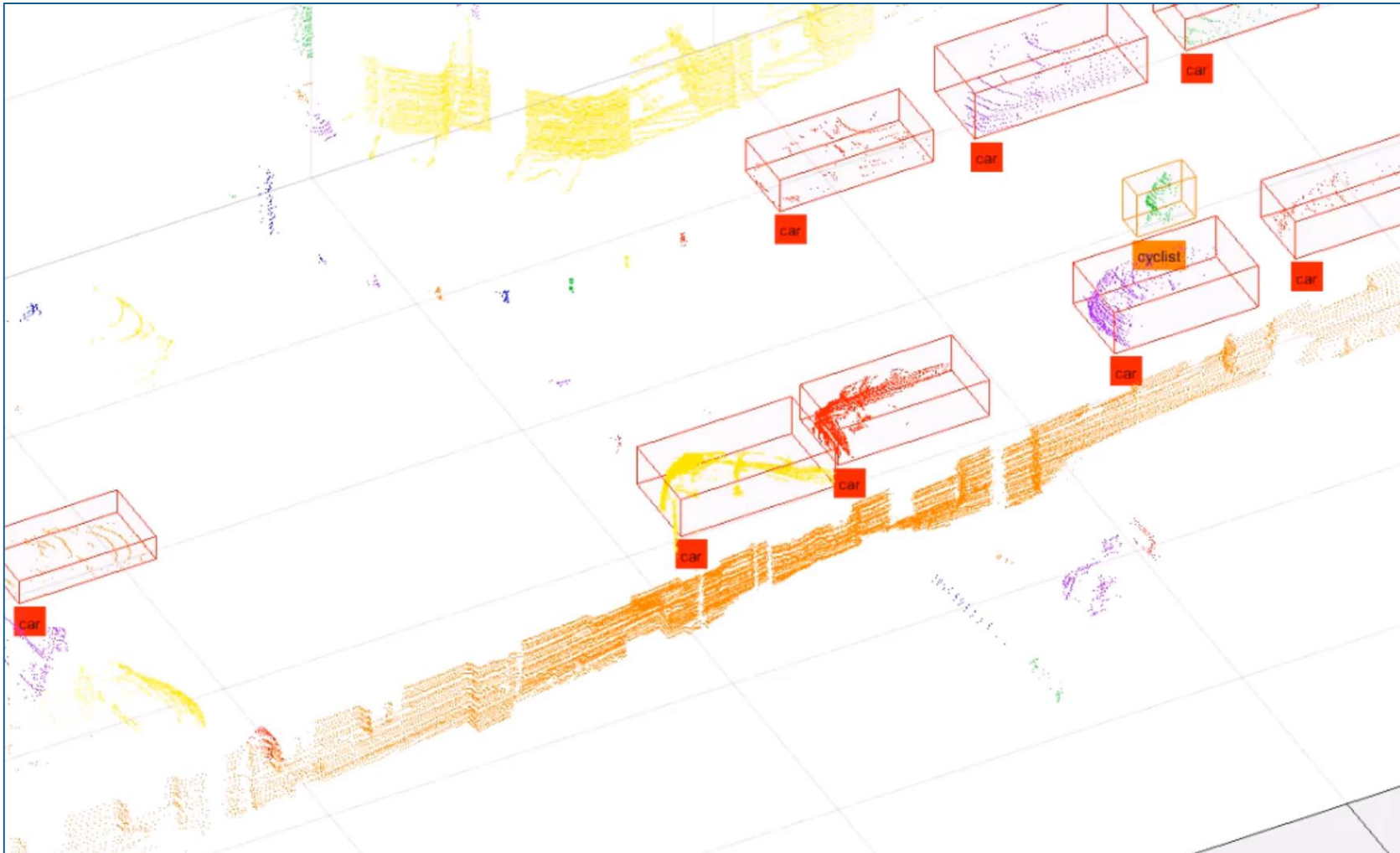


# User Story – Veoneer (Autoliv)

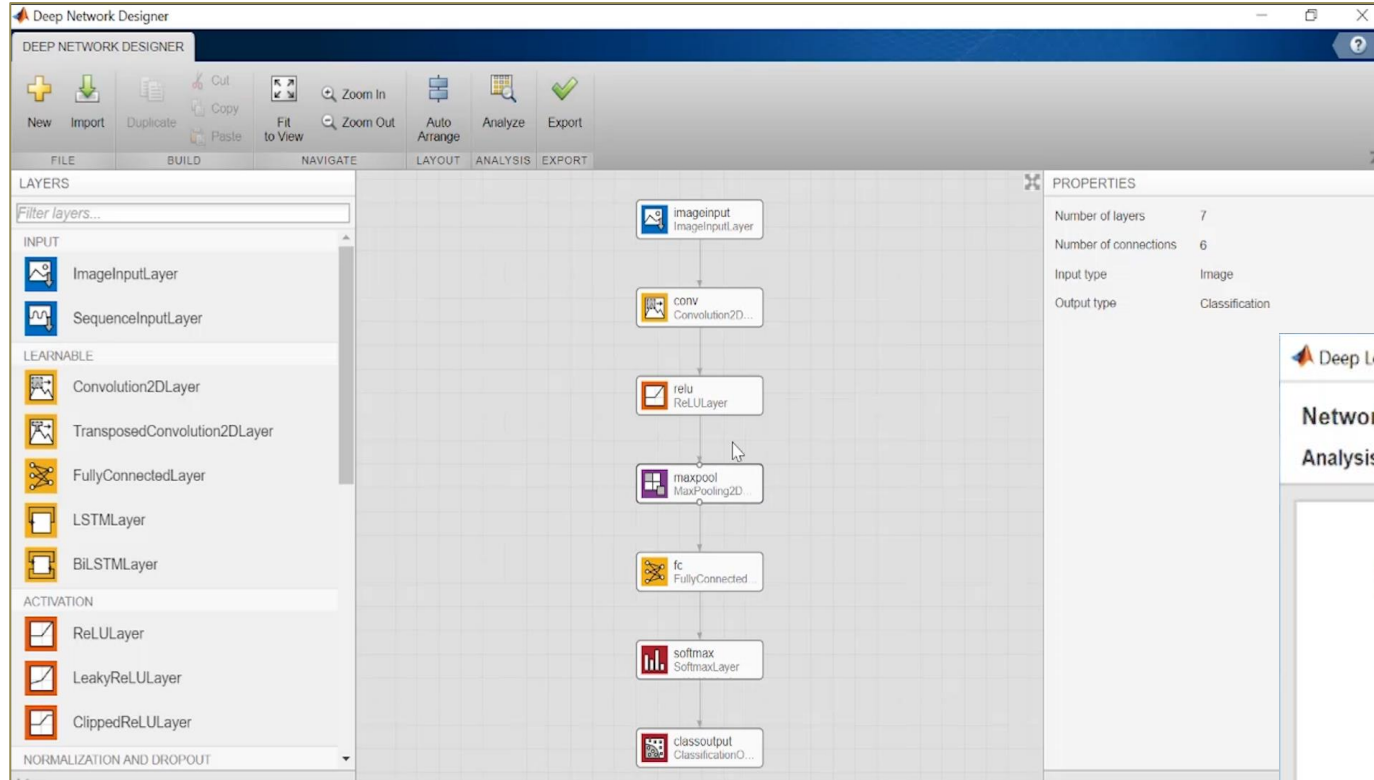
- Automotive:
  - Software and hardware for active safety, autonomous driving, occupant protection, and brake control
- Application:
  - Build radar sensor
  - Check accuracy using LiDAR-based verification
- Used MATLAB to semi-automate labeling and tracking of 3D LiDAR point clouds



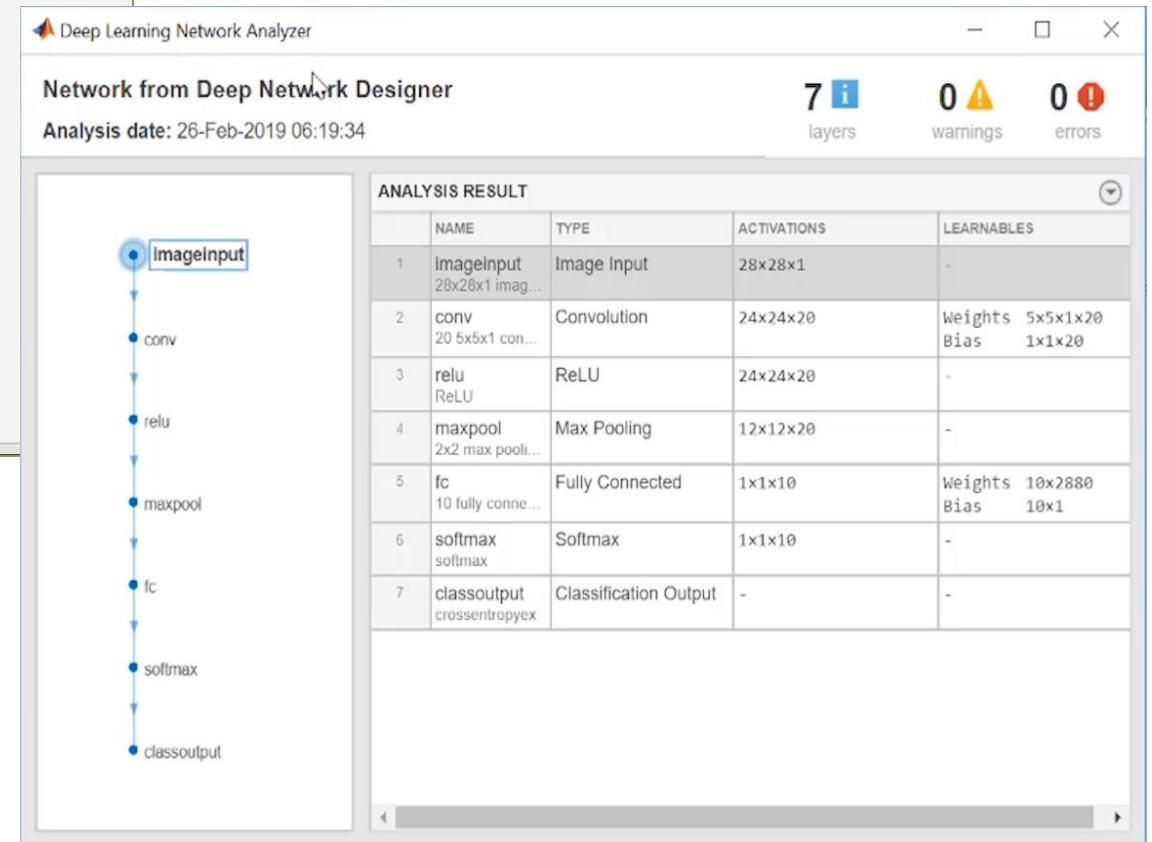
**Manual Labeling for 25 events took over 20 minutes.**  
**After automation with MATLAB tools, it took 5 minutes.**



# Design deep networks interactively



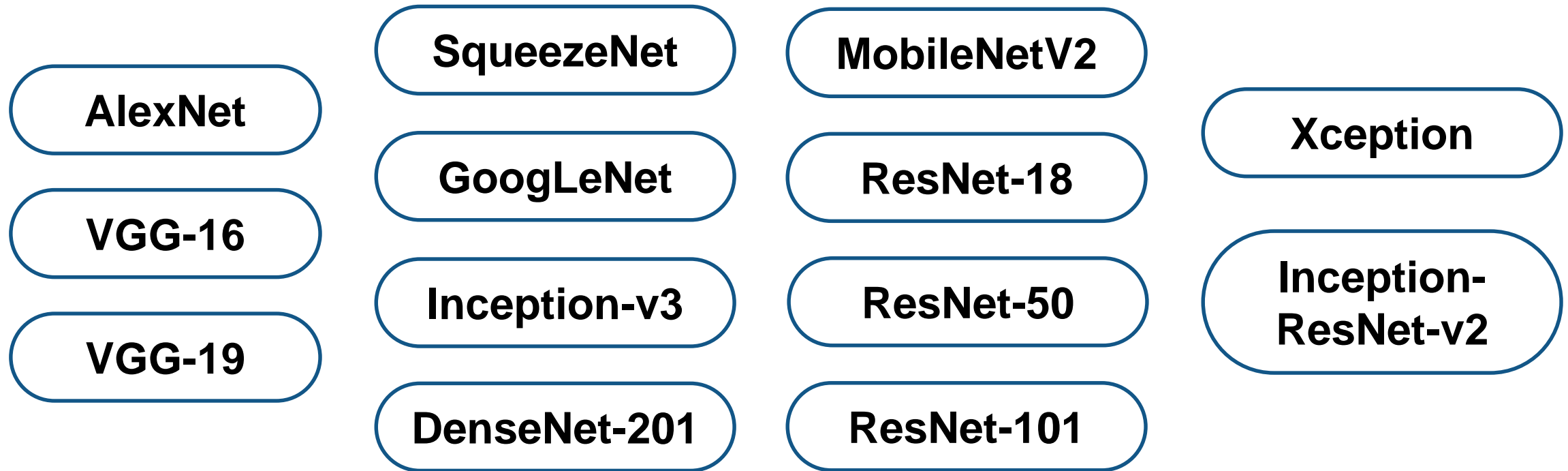
Check for errors with Network Analyzer



Design network with Deep Network Designer



# Transfer Learning with Pre-trained Models



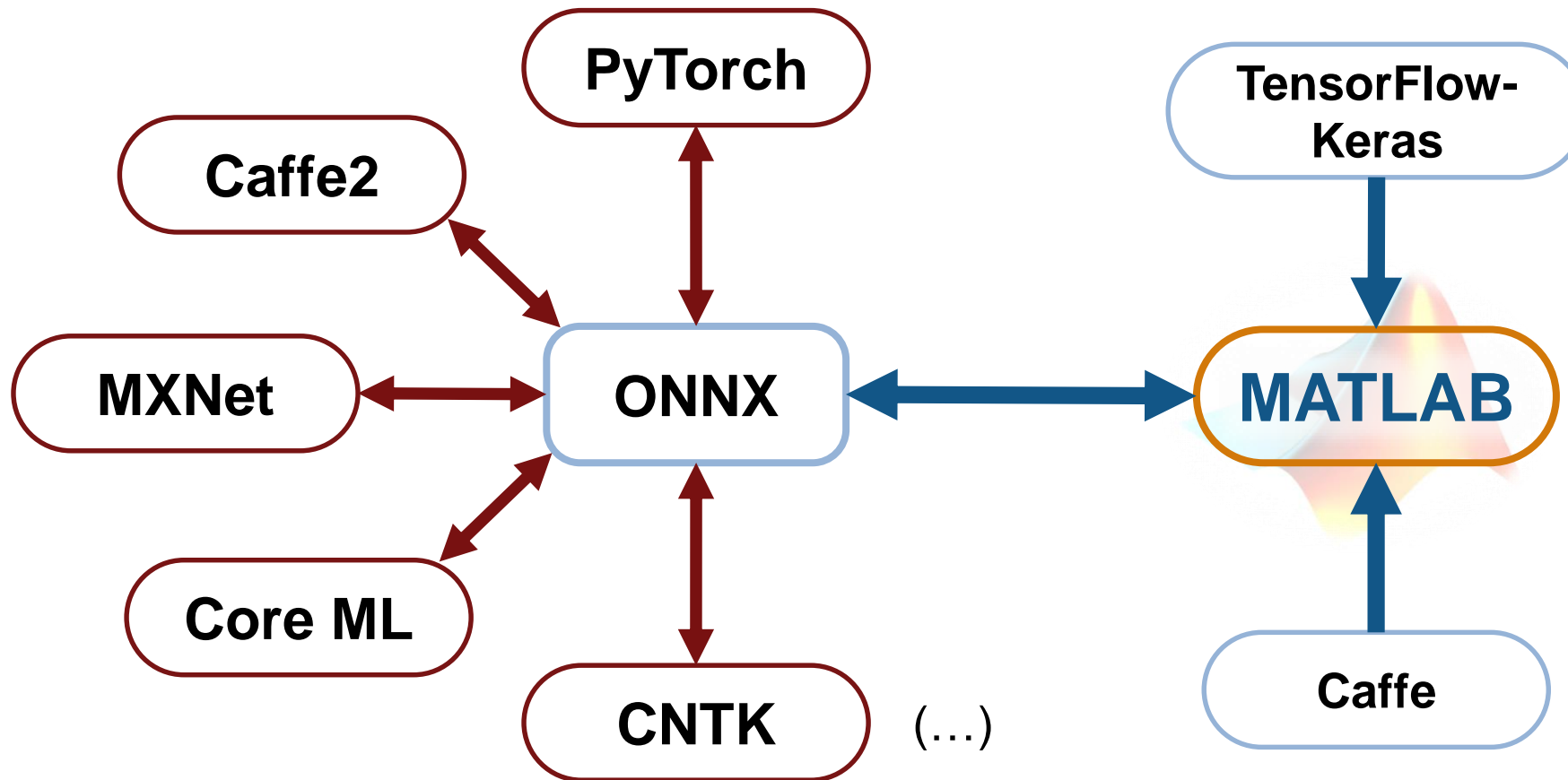
## Import & Export Models Between Frameworks

TensorFlow-Keras  
Importer

Caffe Model  
Importer

ONNX Model  
Converter

# Model Exchange with MATLAB



*ONNX = Open Neural Network Exchange*



# Why MATLAB for AI Tasks?

**Increased productivity with interactive tools**

**Generate simulation data for complex models and systems**

**Ease of deployment and scaling to various platforms**

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**Full AI workflows that cannot be easily replicated by other toolchains**

# Why MATLAB for AI Tasks?

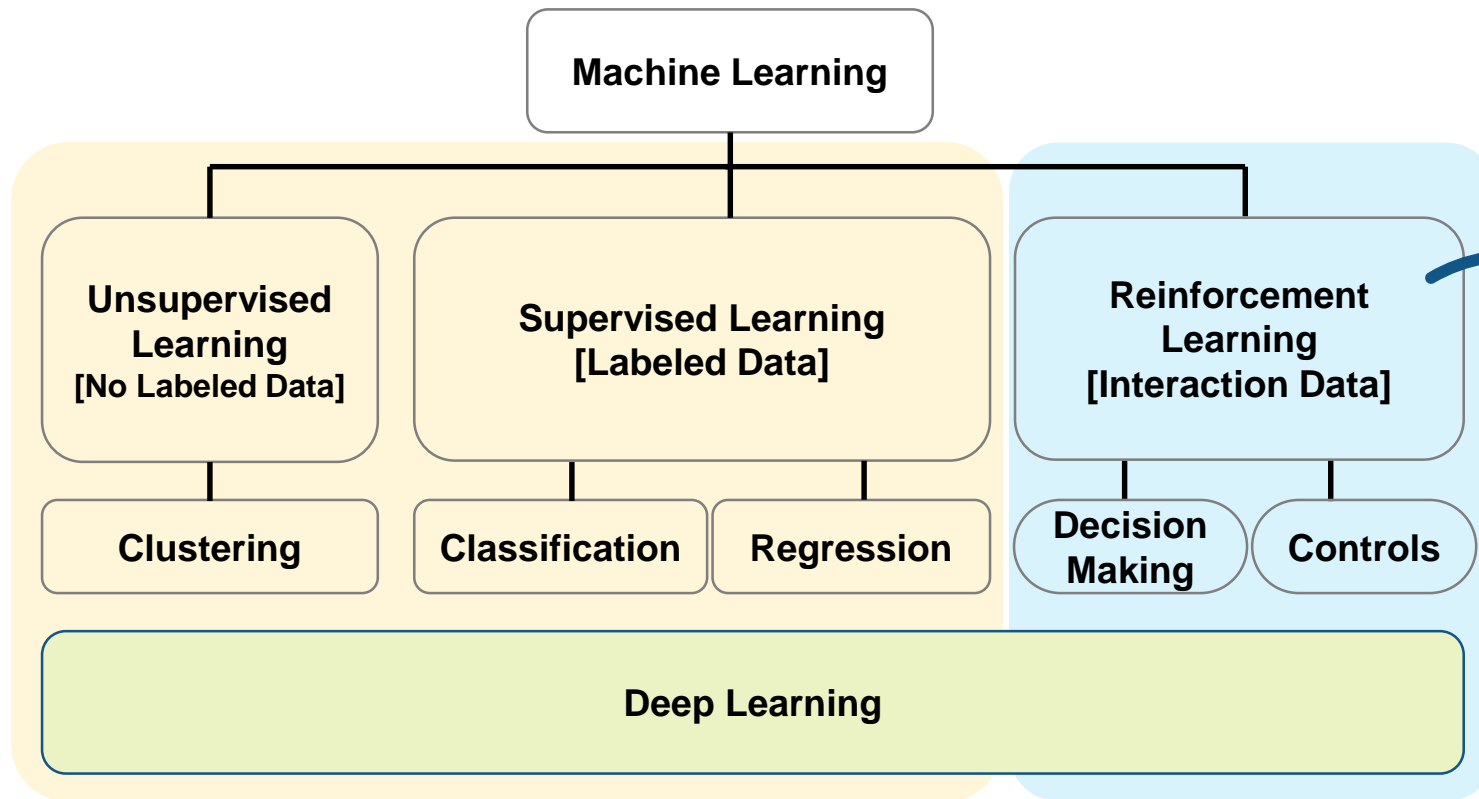
**Generate simulation data for complex models and systems**

**Reinforcement  
Learning**

---

**Full AI workflows that cannot be easily  
replicated by other toolchains**

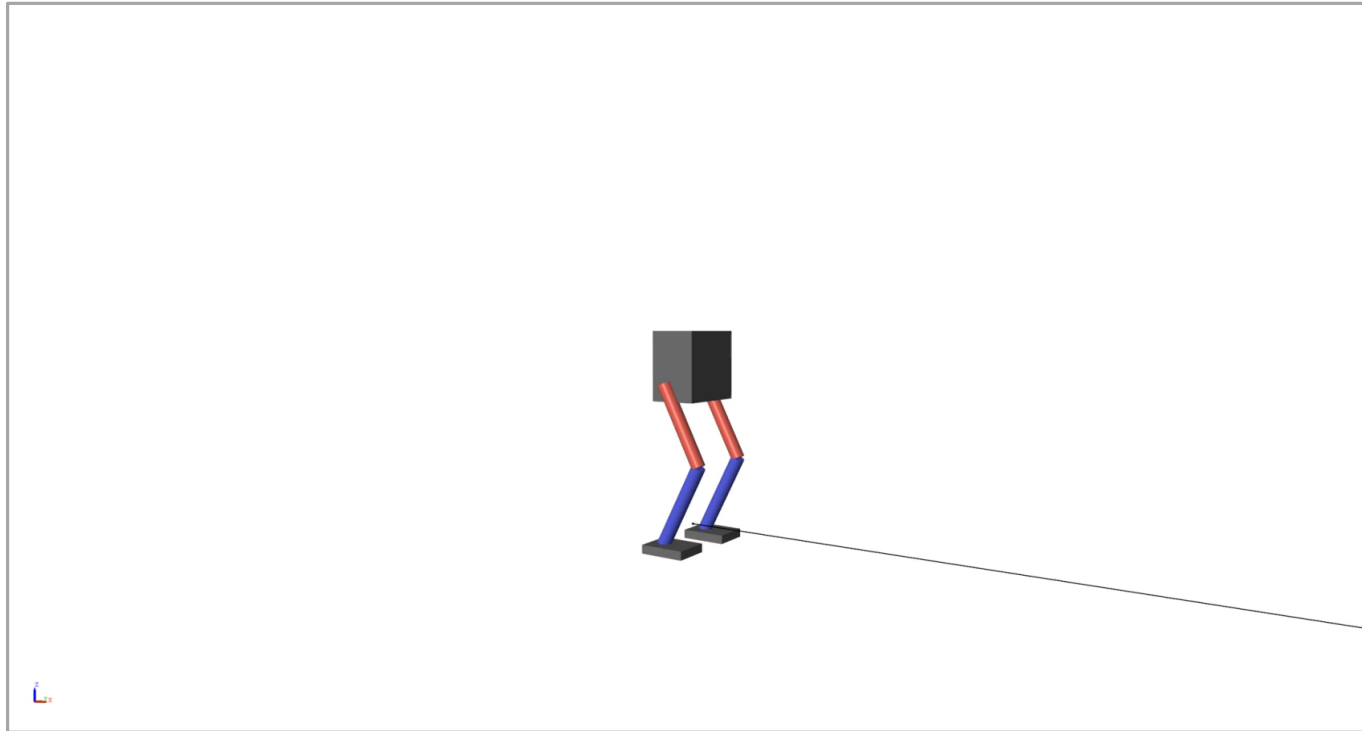
# Reinforcement Learning vs Machine Learning vs Deep Learning



Reinforcement learning learns through trial and error, i.e. **through interaction**

It's about learning a **behavior** or **accomplishing a task**

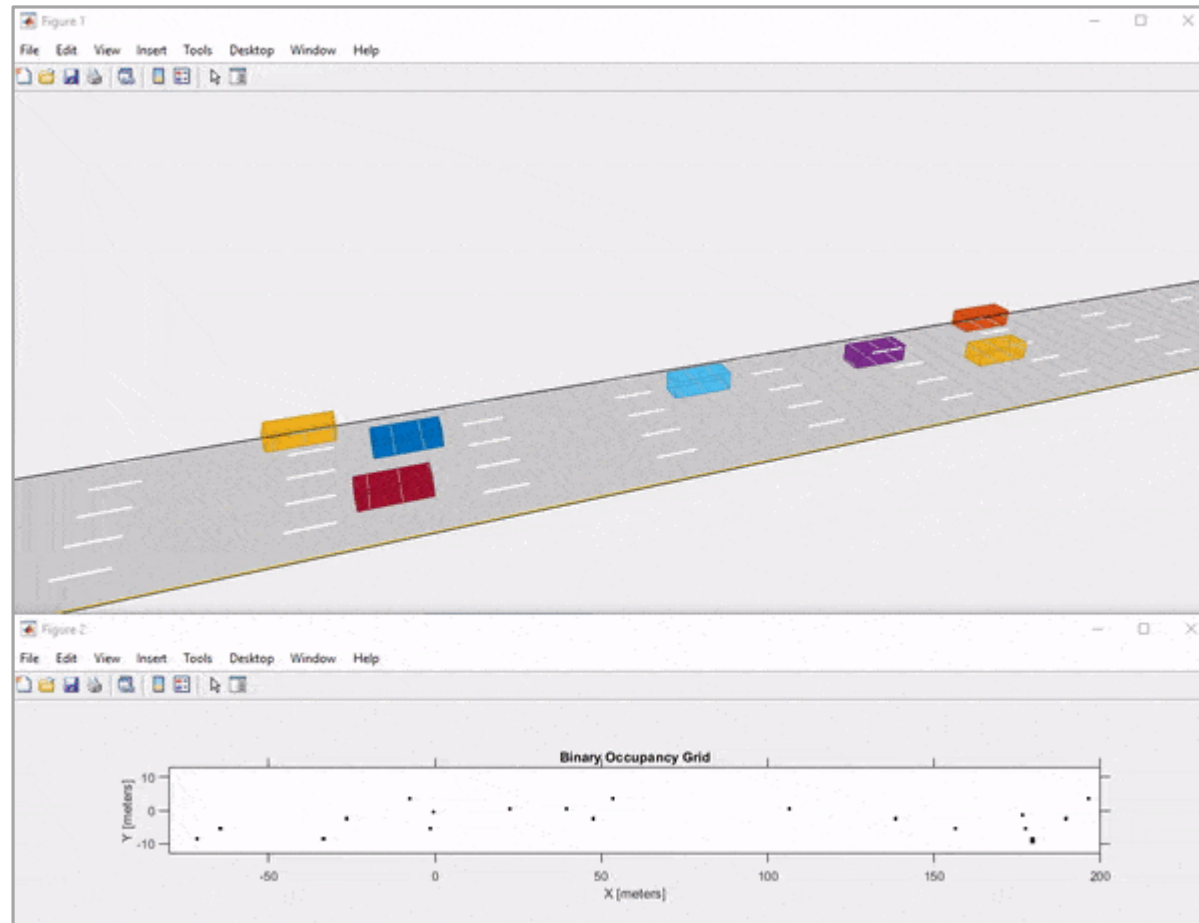
# What is Reinforcement Learning?



Reinforcement learning is a type of machine learning that trains an **agent** through **repeated interactions with an environment** through a **trial & error process** that uses a **reward system to maximize success**

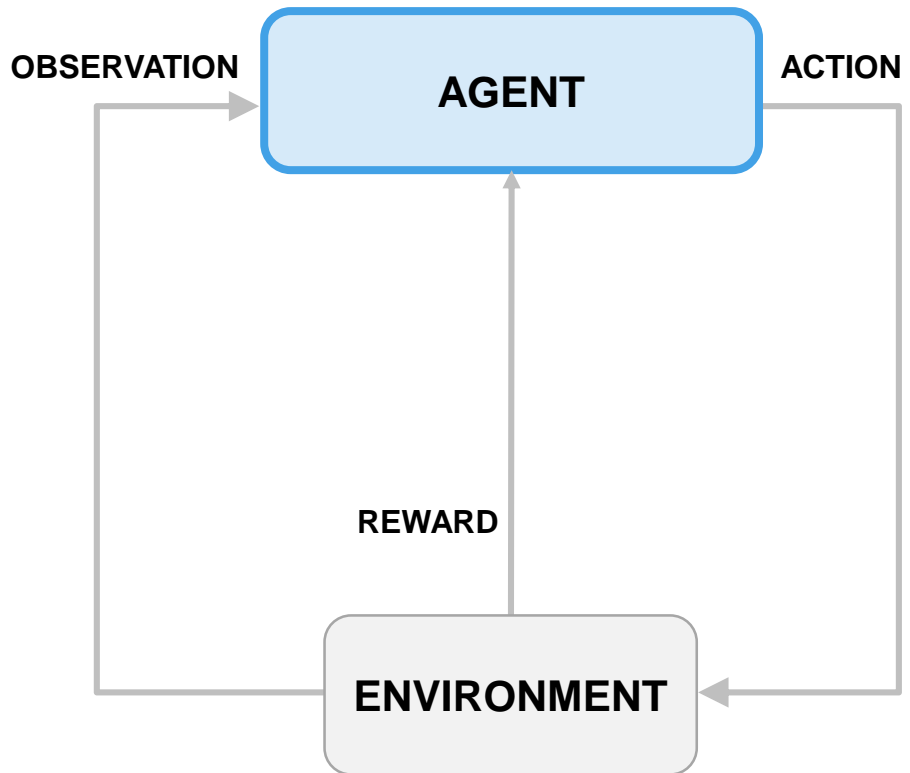
# A Practical Example of Reinforcement Learning

## Training a Self-Driving Car



# A Practical Example of Reinforcement Learning

## Training a Self-Driving Car

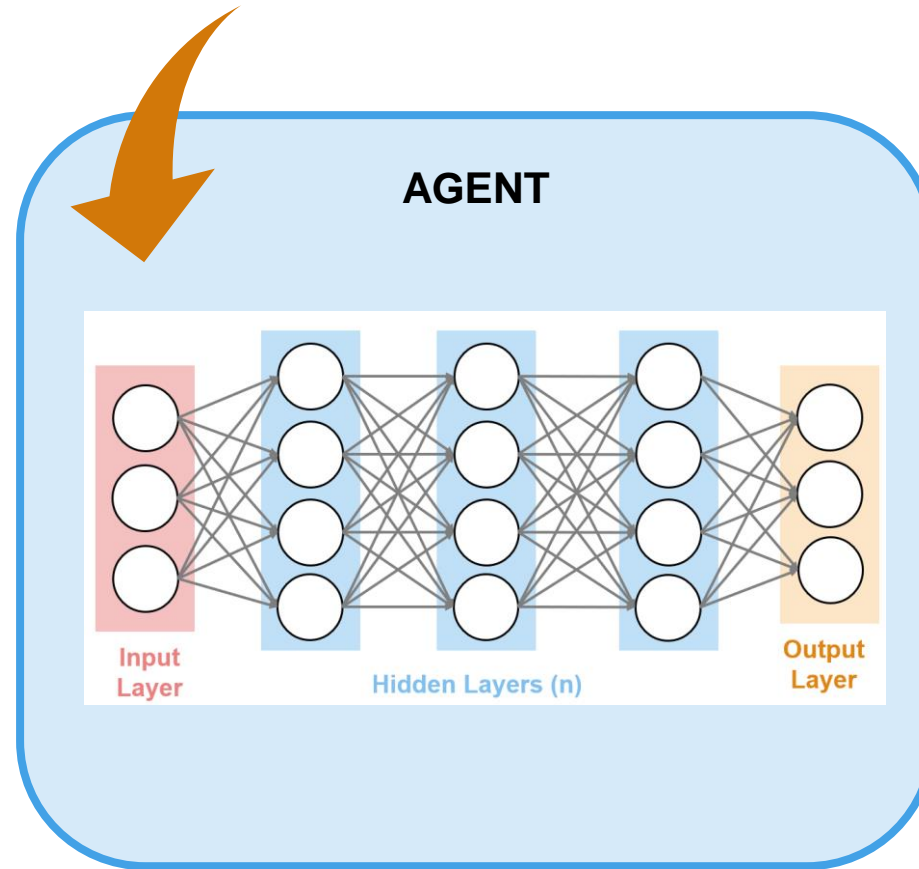
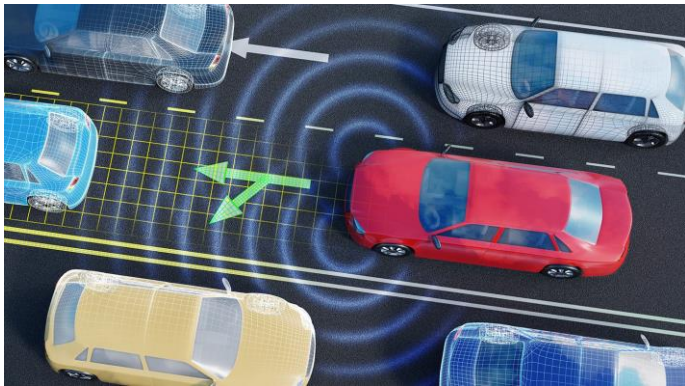


- ▶ Vehicle's computer learns how to drive **[agent]**
- ▶ using sensor readings from LIDAR, cameras **[observation]**
- ▶ that represent road conditions, vehicle position **[environment]**
- ▶ by generating steering, braking, throttle commands **[action]**
- ▶ to avoid collisions and lane deviation **[reward]**.

**The goal of reinforcement learning is for the agent to find an optimal algorithm for performing a task**

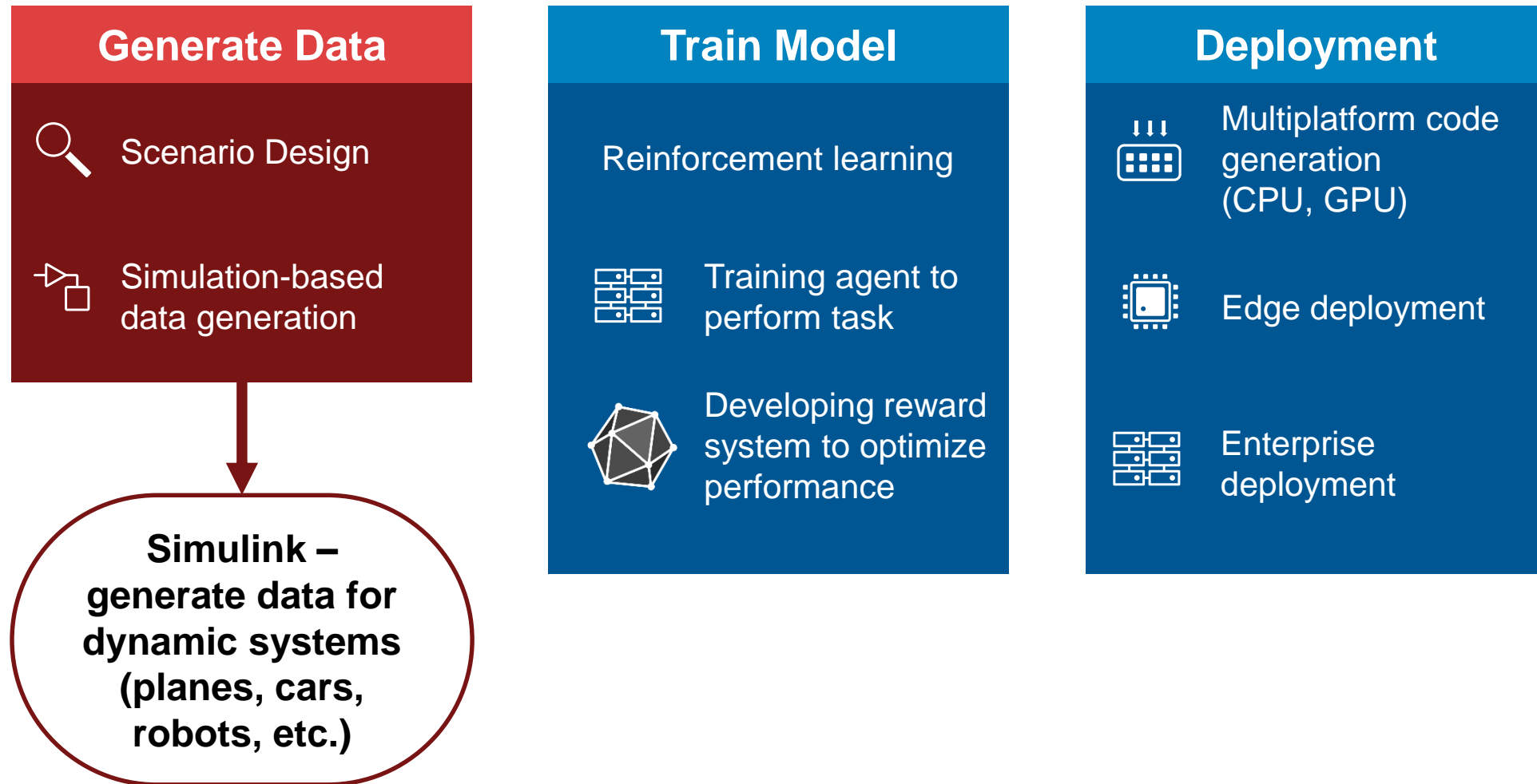


**Deep Networks are commonly found in the agent, because they can model complex problems.**

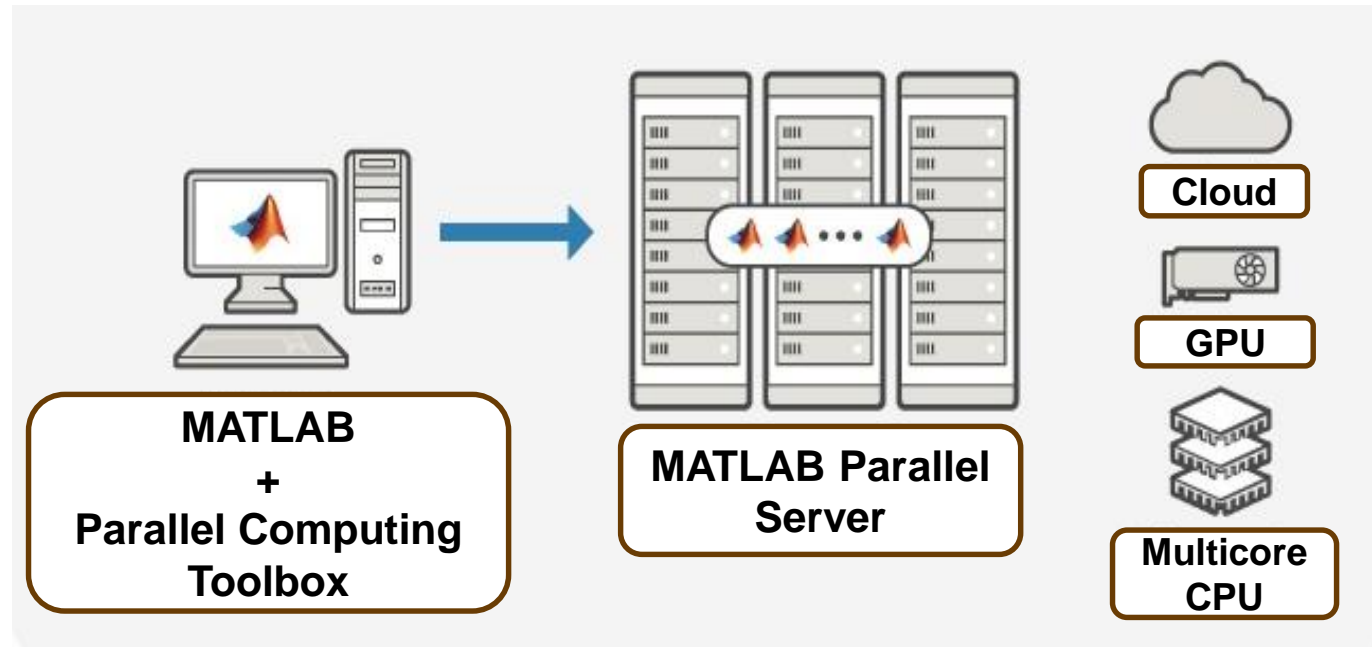


- **Turn left**
- **Turn right**
- **Brake**
- **Accelerate**

# Reinforcement Learning Workflow



# Scaling up deep learning in parallel and in the cloud



*Run thousands of simulations in parallel with MATLAB Parallel Server to save hours of training time.*

# MATLAB and Simulink for Reinforcement Learning

- Reinforcement learning is a **dynamic** process
- MATLAB and Simulink virtual models allow you to **simulate conditions that are difficult or dangerous to emulate in the real world**
- Suitable for:
  - **Control-based** problems, e.g. automated driving (lane keep assist, adaptive cruise control), robotics, etc.
  - **Decision-making** problems, e.g. financial trading, games, etc.



# Why MATLAB for AI Tasks?

**Increased productivity with interactive tools**

**Generate simulation data for complex models and systems**

**Ease of deployment and scaling to various platforms**

---

**Full AI workflows that cannot be easily replicated by other toolchains**

# Why MATLAB for AI Tasks?

**Ease of deployment and scaling to various platforms**

**Code  
Generation**

**Embedded  
Devices**

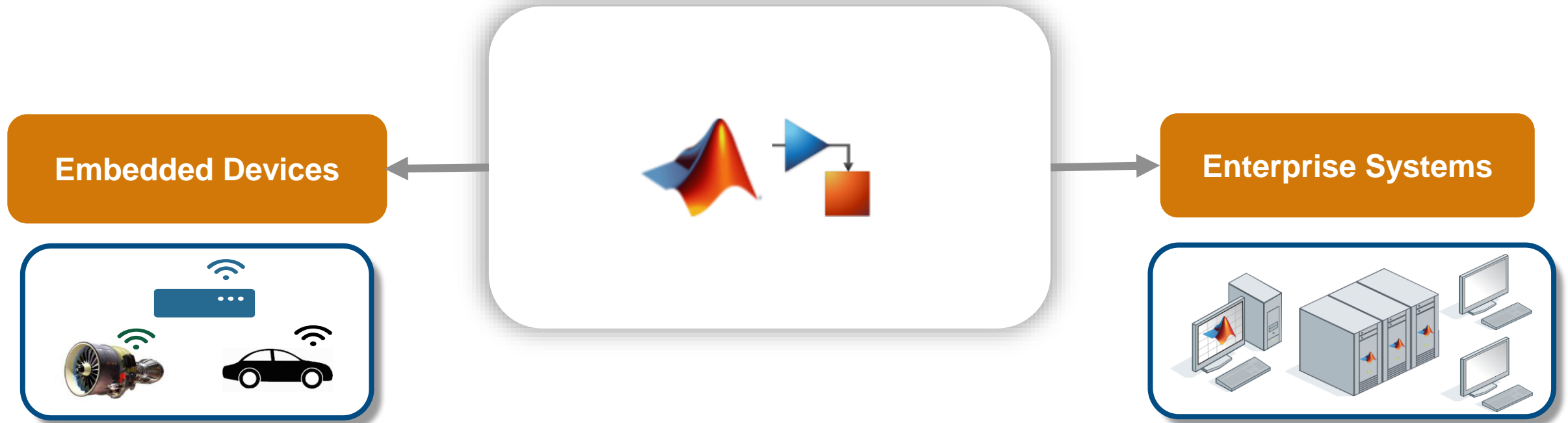
**Enterprise  
Systems**

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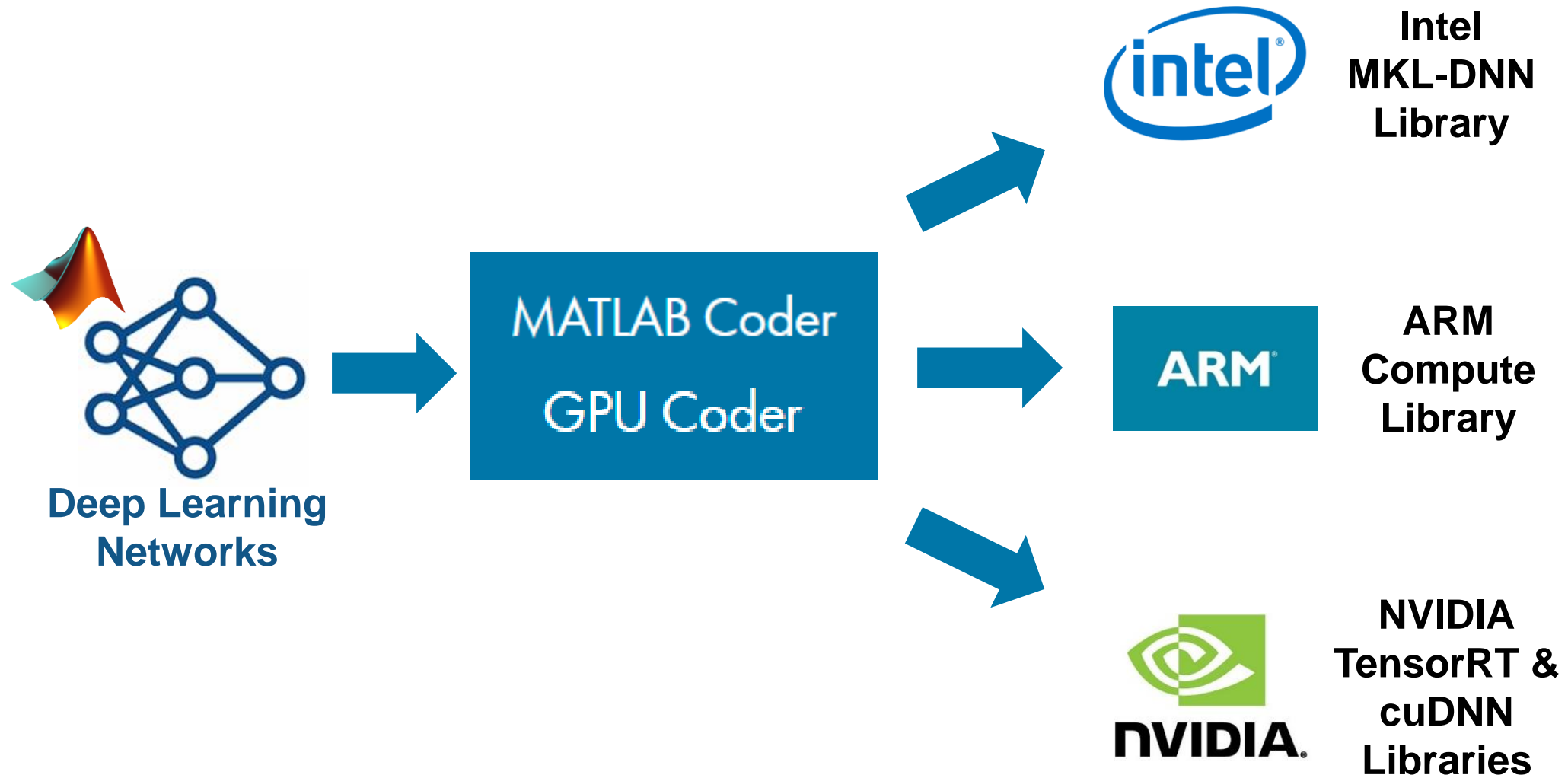
**Full AI workflows that cannot be easily  
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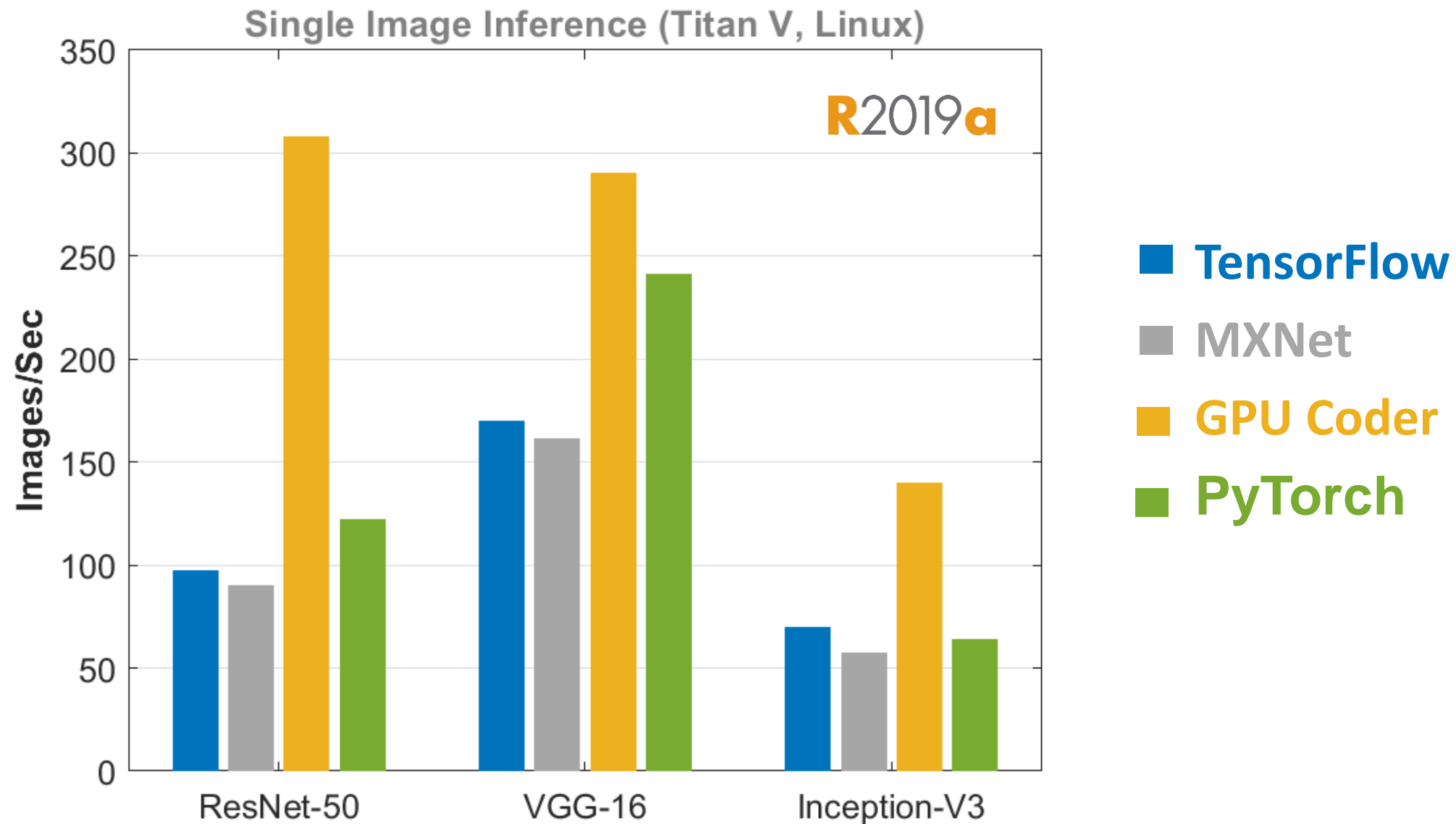
# Deployment and Scaling for AI



# Deploying Deep Learning Models for Inference



# Benchmark of GPU Coder



# Musashi Seimitsu Industry Co.,Ltd.

## Detect Abnormalities in Automotive Parts



Automated visual inspection of 1.3 million  
bevel gear per month

### **MATLAB use in project:**

- Preprocessing of captured images
- Image annotation for training
- Deep learning-based analysis
  - Various transfer learning methods (Combinations of CNN models, Classifiers)
  - Estimation of defect area using Class Activation Map (CAM)
  - Abnormality/defect classification
- Deployment to NVIDIA Jetson using GPU Coder

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