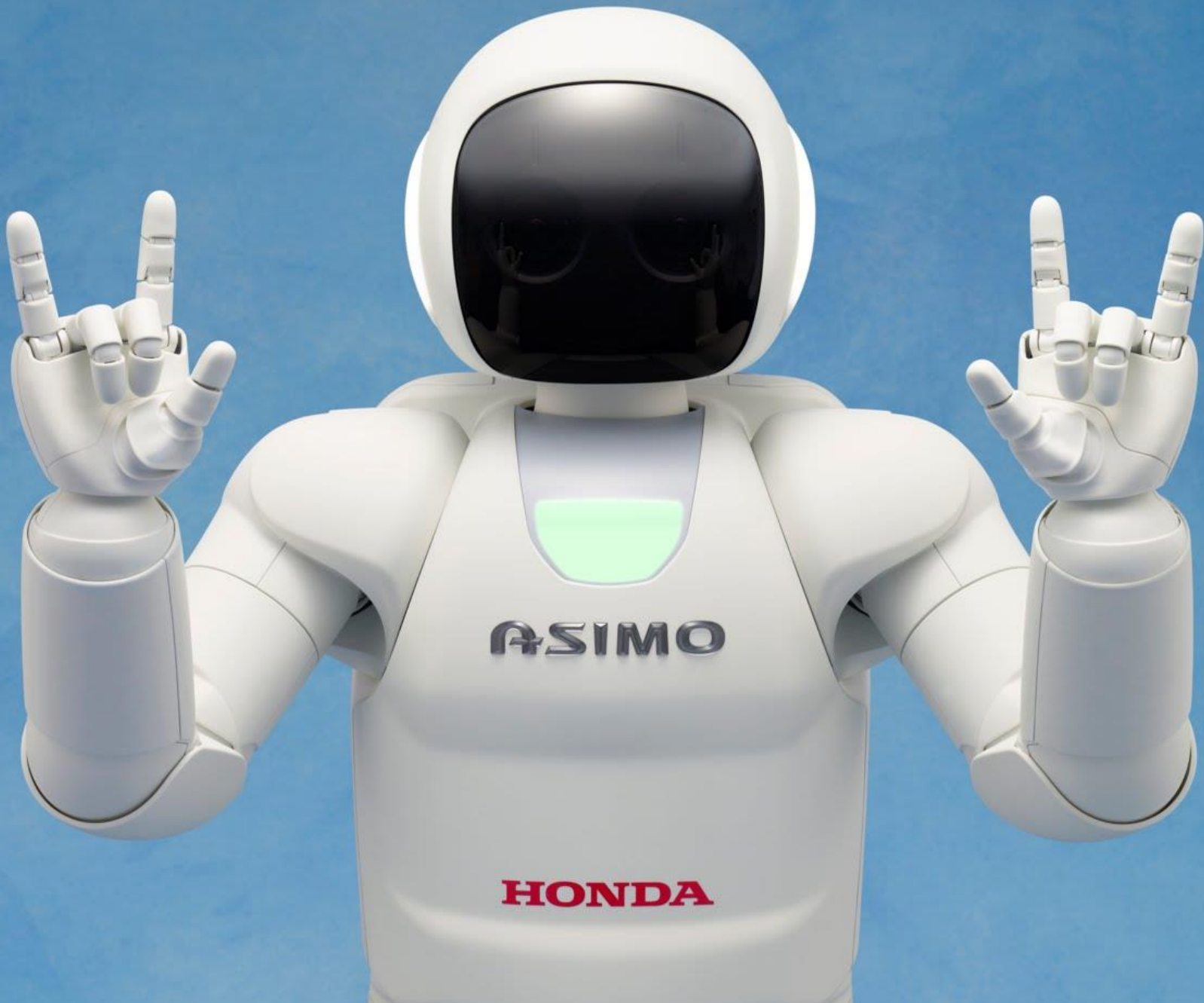


# MATLAB EXPO 2017

How to build an **autonomous** anything

Jim Tung  
MathWorks Fellow  
MathWorks

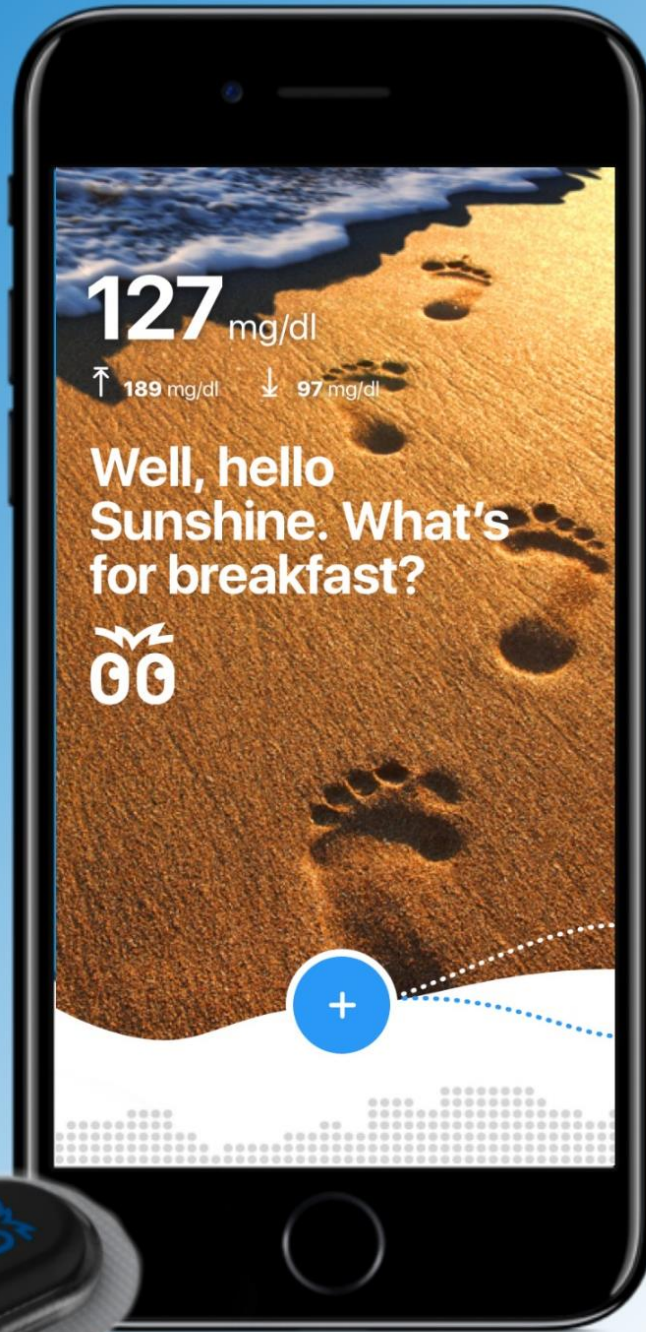












# Autonomous Technology



# Autonomous

*Acting independently*

# Autonomous Technology

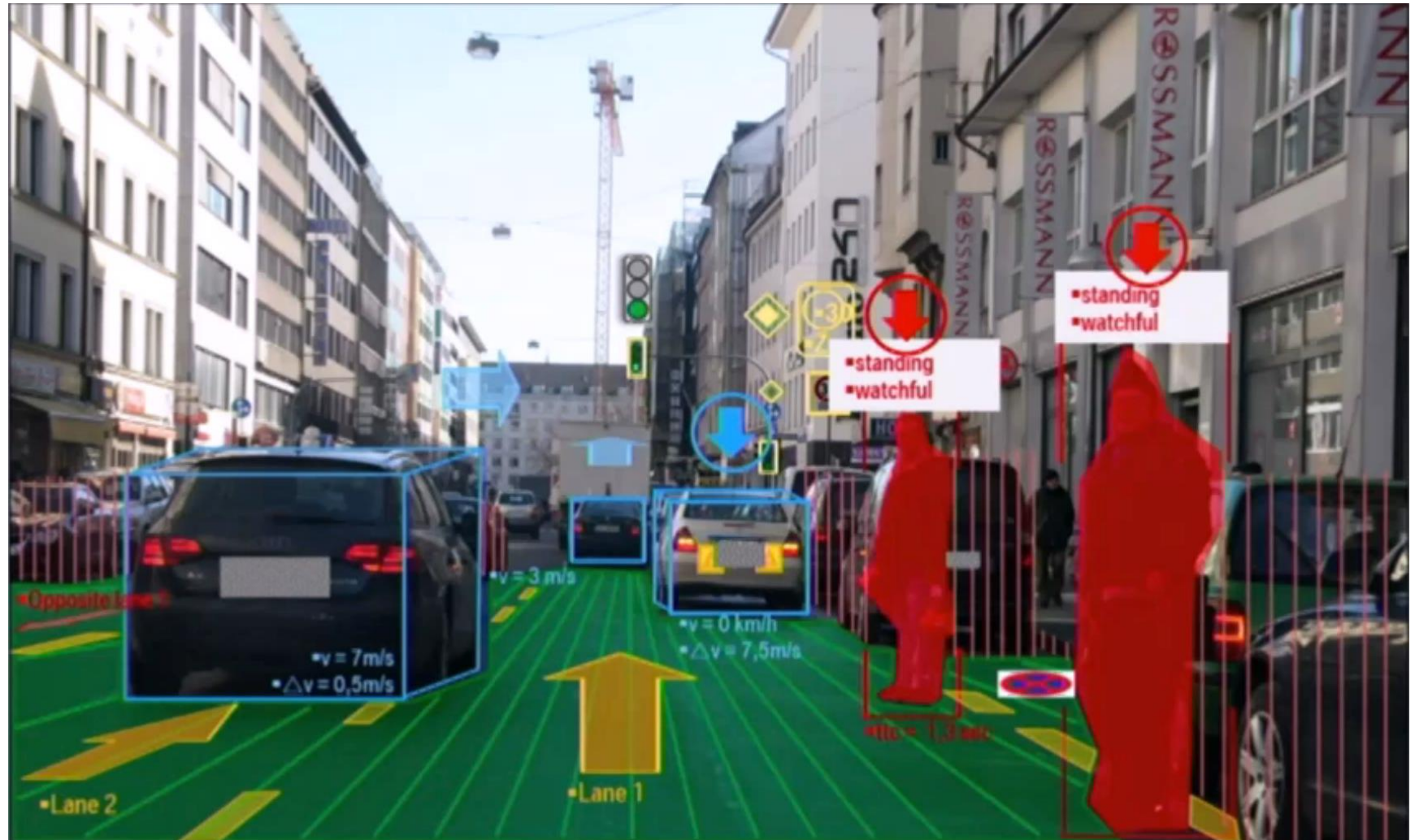
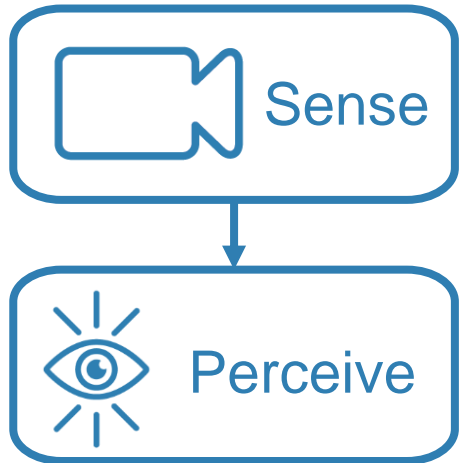
*Provides the ability of a system to act  
**independent** of direct human control  
under **unrehearsed** conditions*



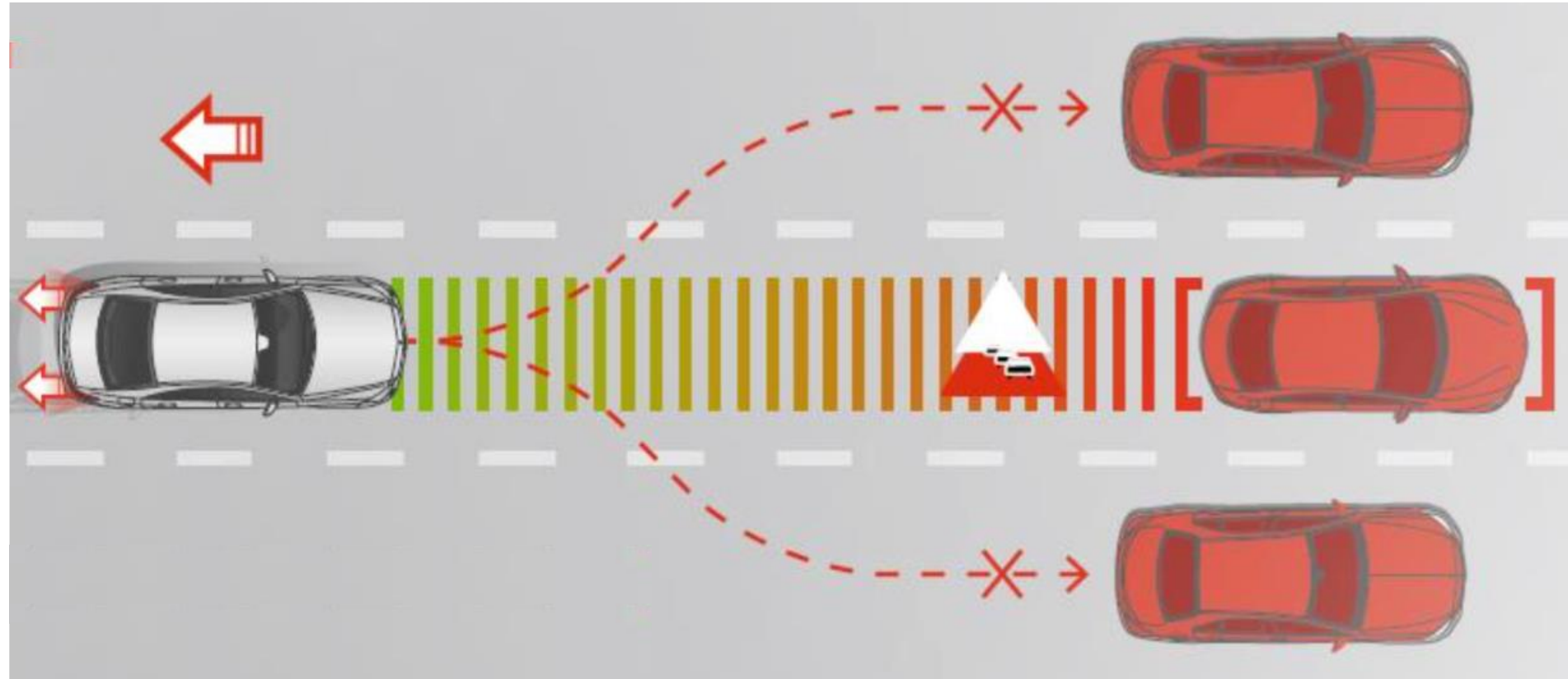
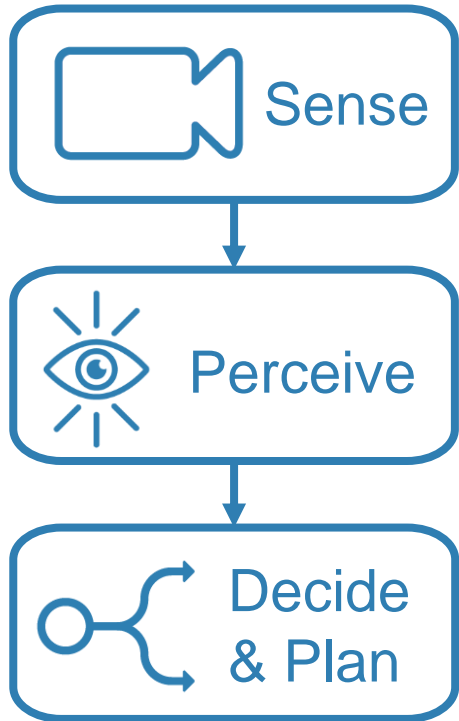
# Capabilities of an Autonomous System



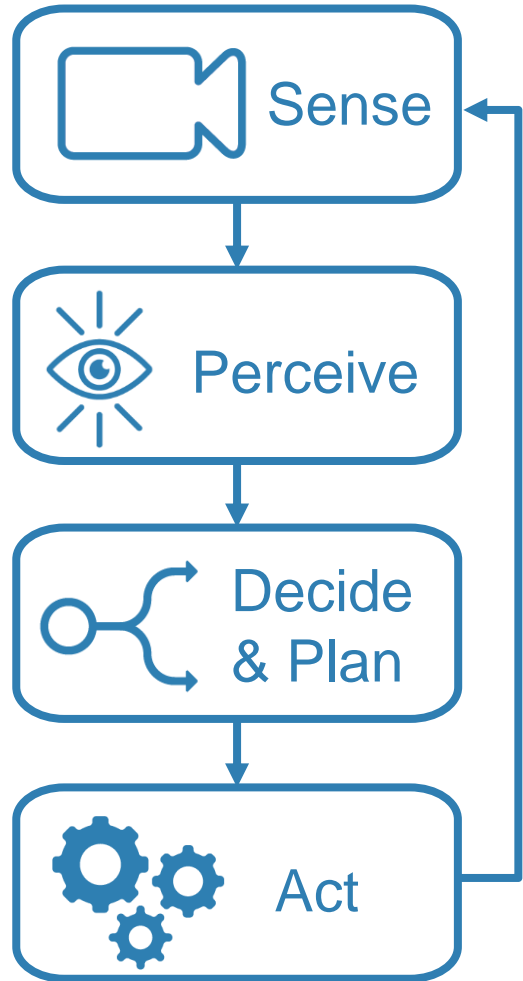
# Capabilities of an Autonomous System



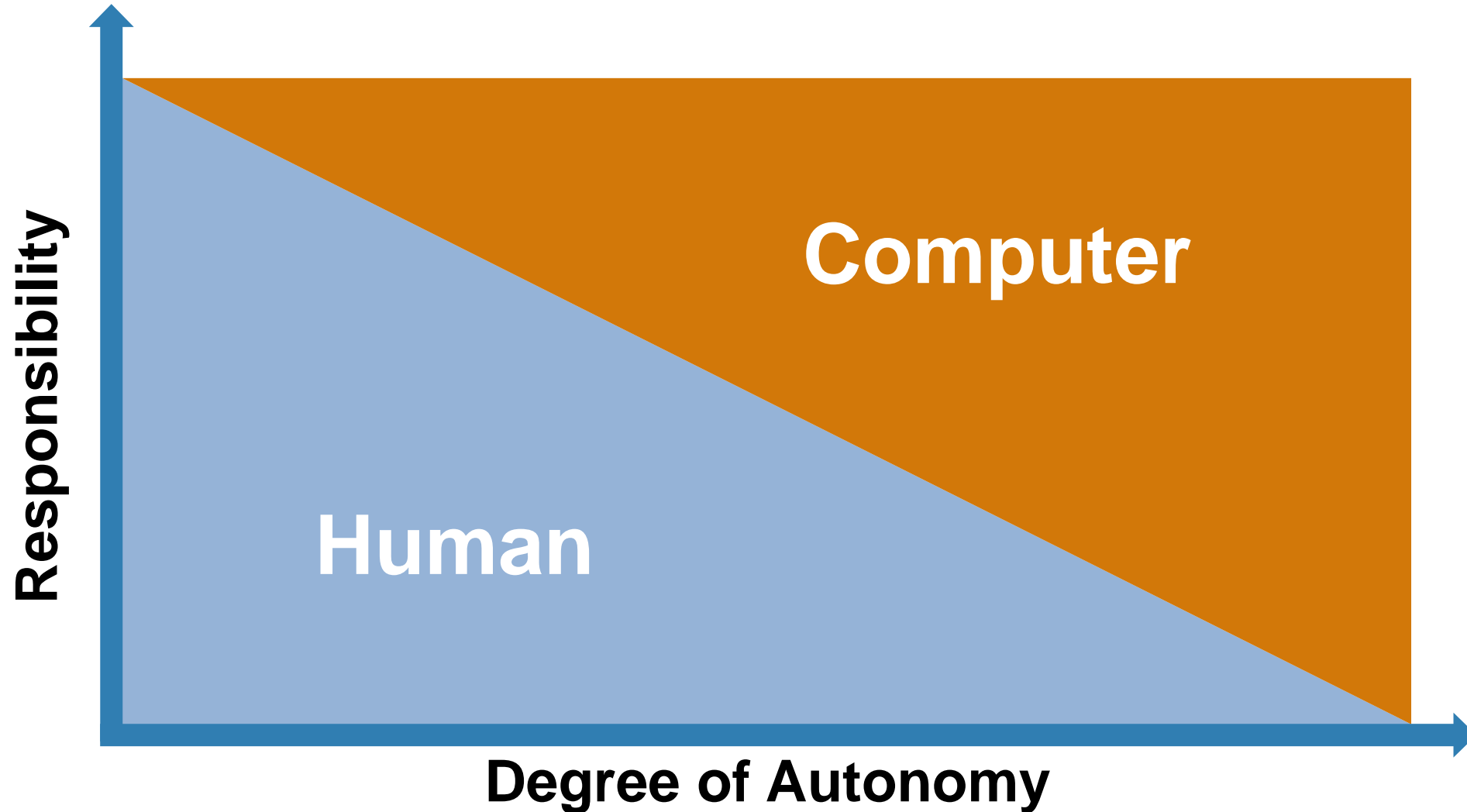
# Capabilities of an Autonomous System



# Capabilities of an Autonomous System



# Autonomous Technology – Balancing Responsibility





**Cost of rig: \$1,000,000+**

**Repair cost: \$100,000**

**Cost of valve: \$200**



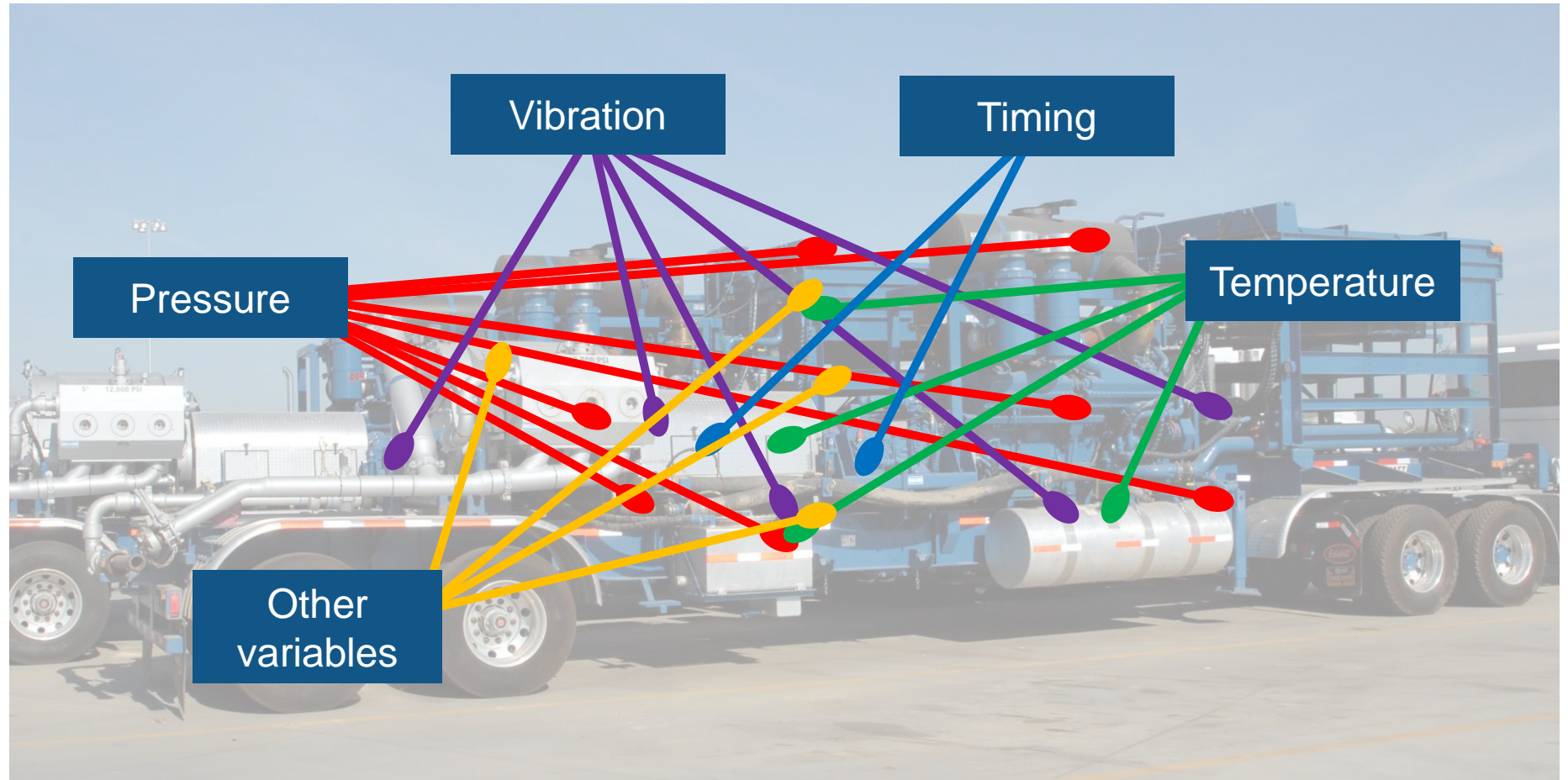
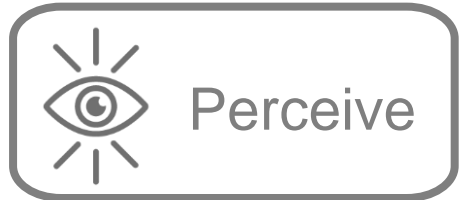




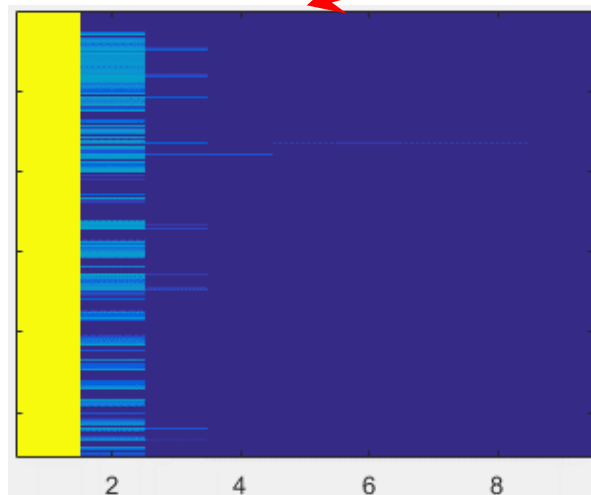
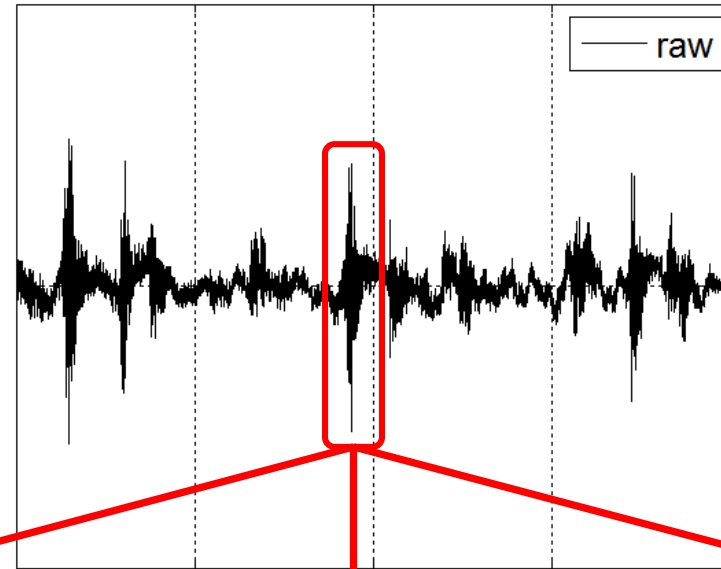
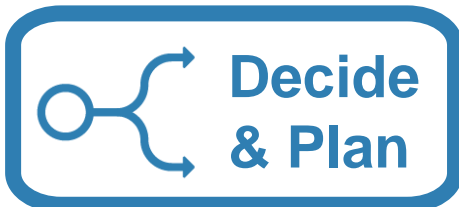
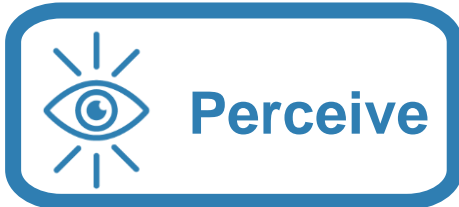


# Autonomous Service for Predictive Maintenance

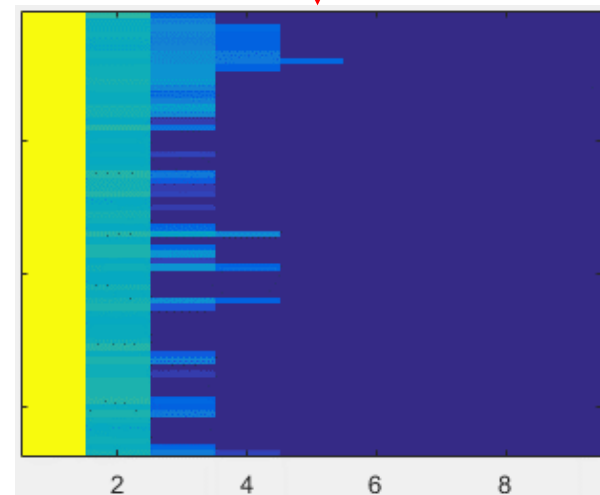
Which sensor values should they use?



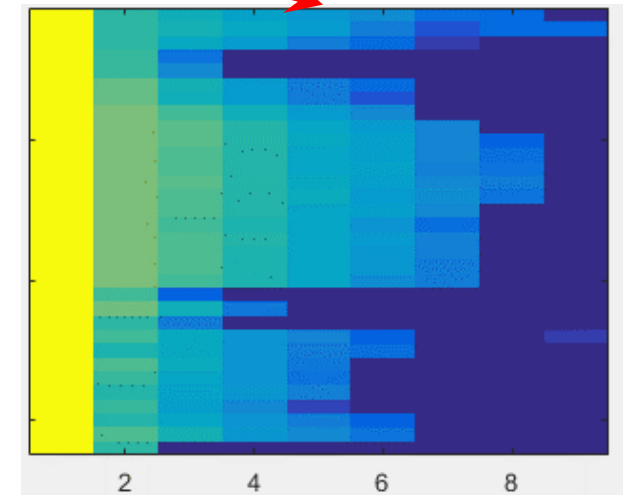
# Autonomous Service for Predictive Maintenance



Normal Operation



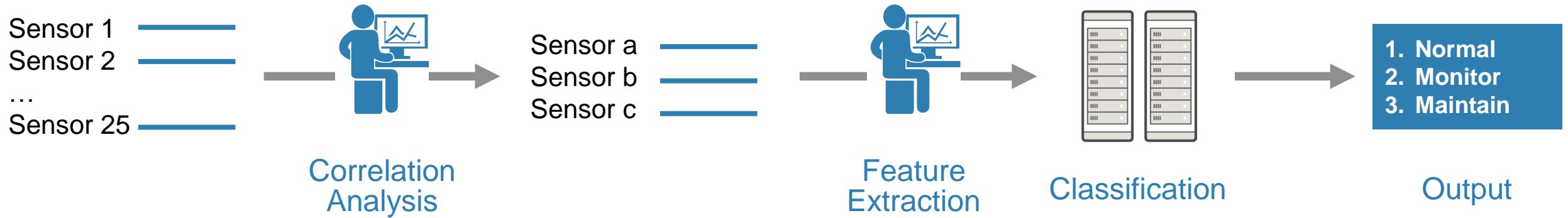
Monitor Closely



Maintenance Needed

# Machine Learning or Deep Learning?

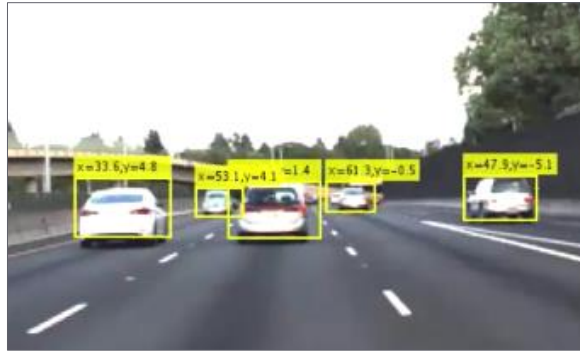
## Machine Learning Approach



## Deep Learning Approach



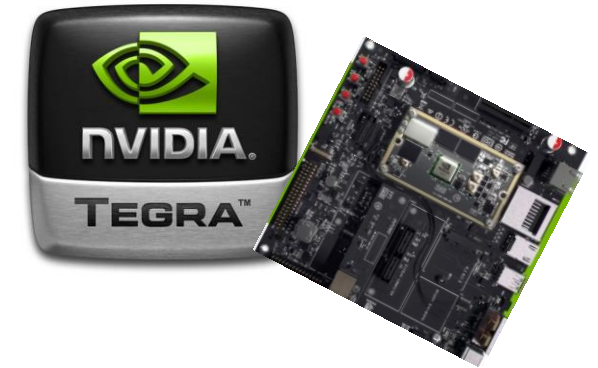
# R2017b Mega Release of Deep Learning Capabilities



Design Deep Learning  
& Vision Algorithm



Accelerate and Scale  
Training



High Performance  
Embedded Implementation

Deep learning design is **easy**  
in **MATLAB**

**Apps** for Ground Truth Labeling,  
Pixel Labeling  
Pre-trained **model importer**  
Training Visualization

**Parallel Computing Toolbox**

**7x** faster than pyCaffe  
**2x** faster than TensorFlow

**GPU Coder**

**14x** faster than pyCaffe  
**4x** faster than TensorFlow  
**1.6x** faster than C++ Caffe

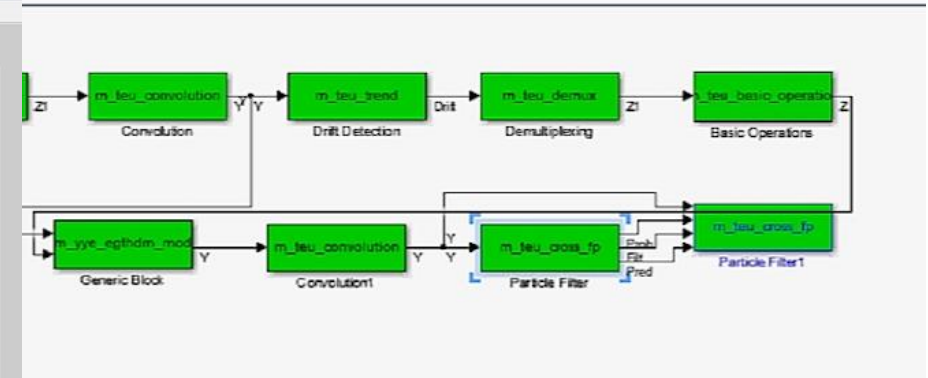
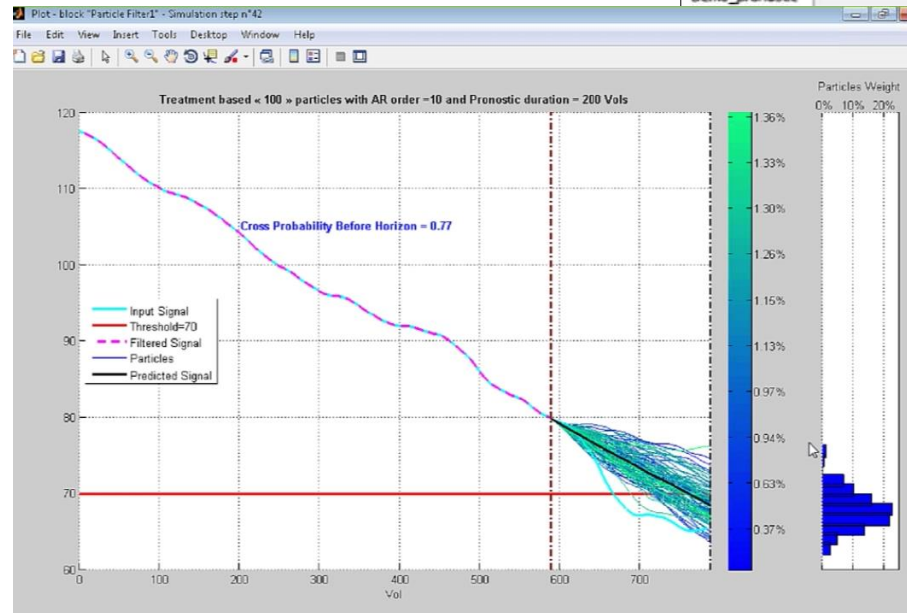
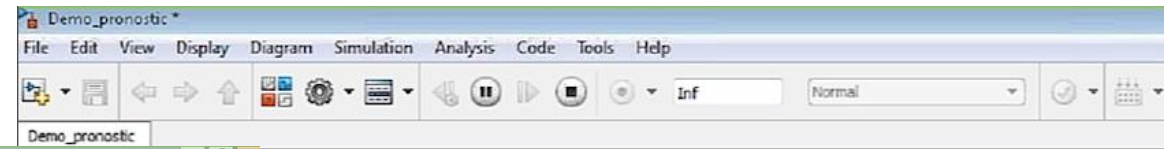


# What are the best predictors?

- Data-driven

# What are the best predictors?

- Data-driven
- Model-driven



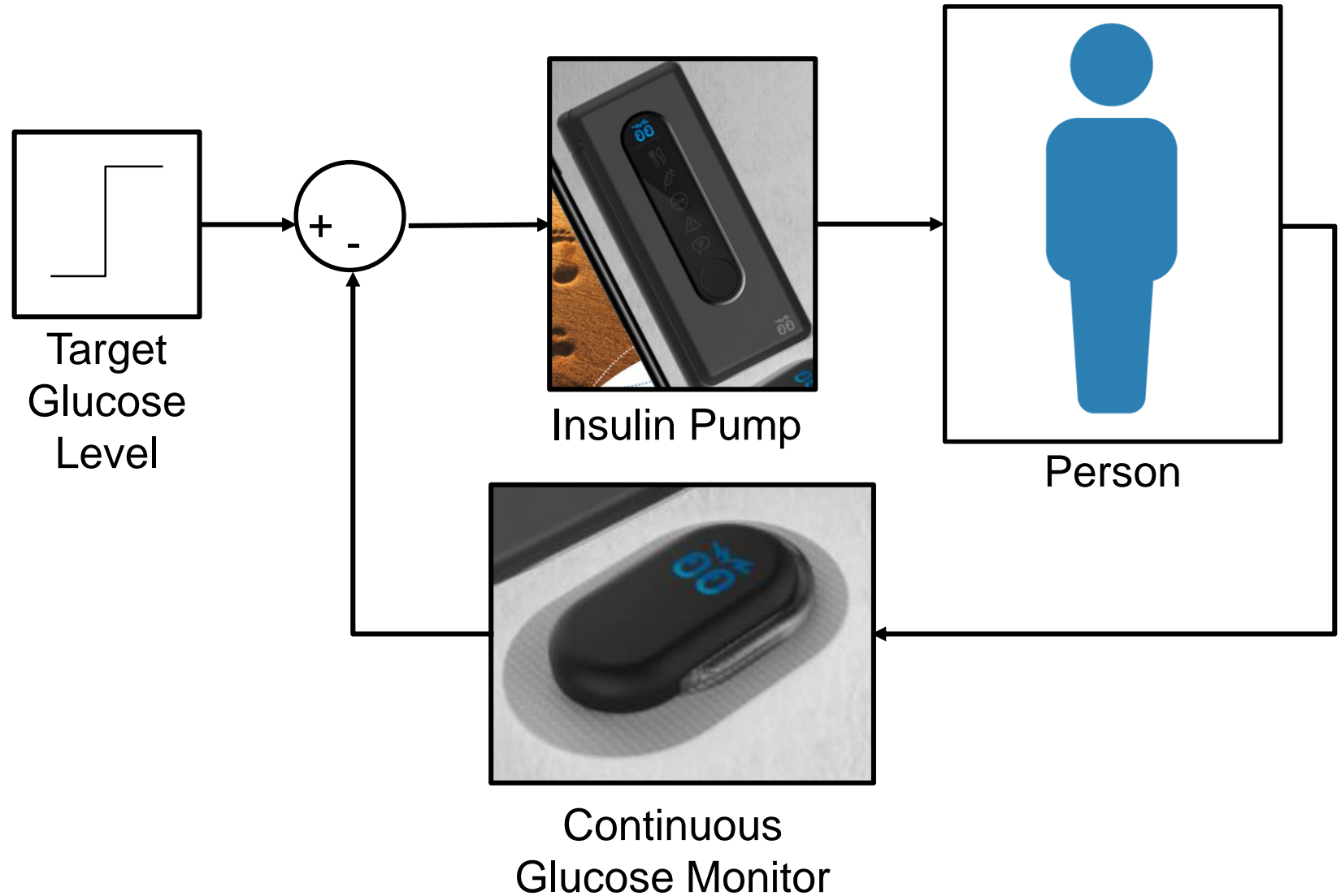
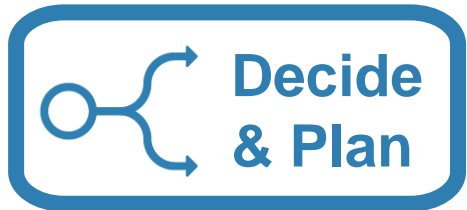
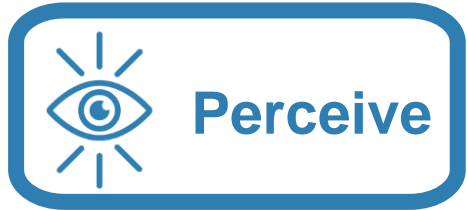
Jet Engine Monitoring

# Autonomous Glucose Level Management



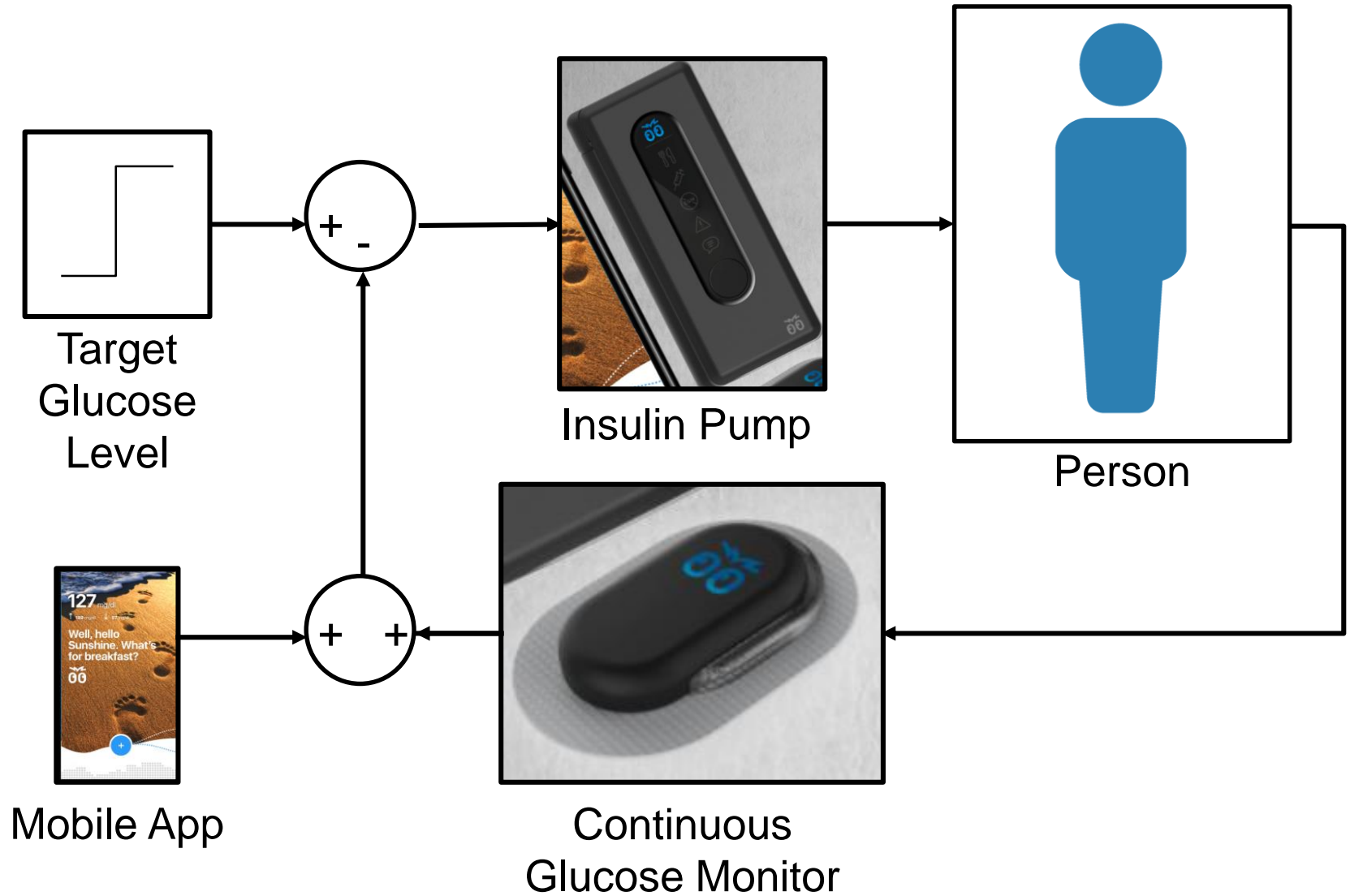
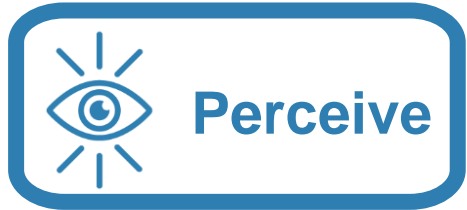
# Autonomous Glucose Level Management

## Bigfoot Biomedical



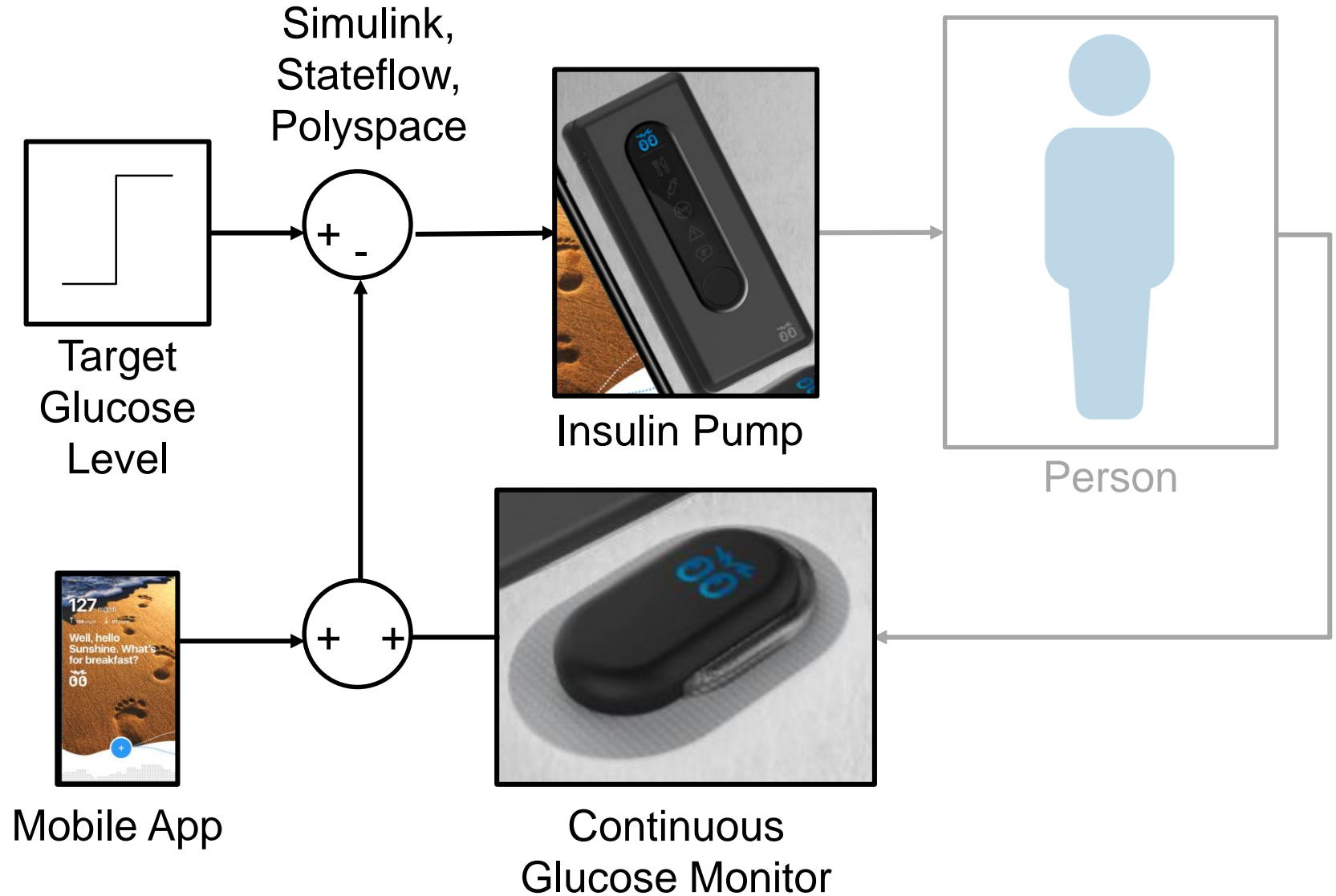
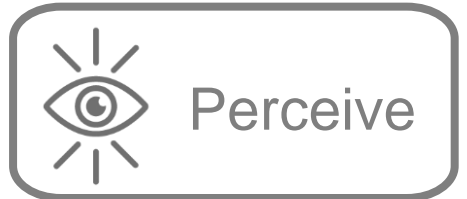
# Autonomous Glucose Level Management

## Bigfoot Biomedical



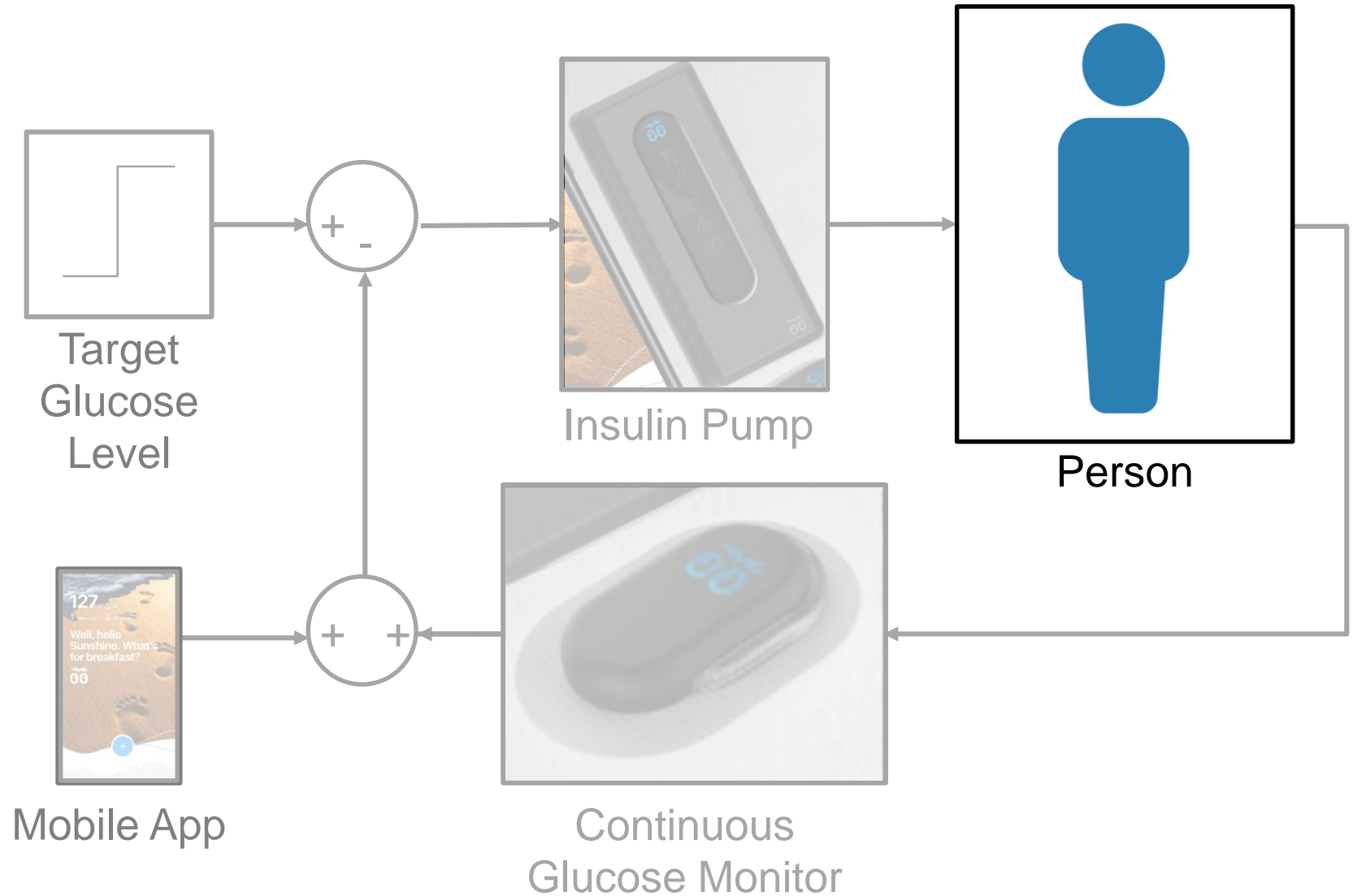
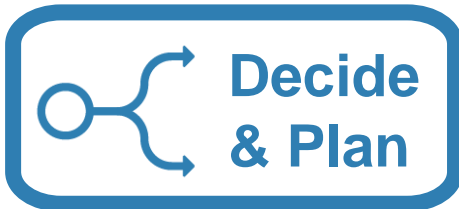
# Autonomous Glucose Level Management

## Bigfoot Biomedical



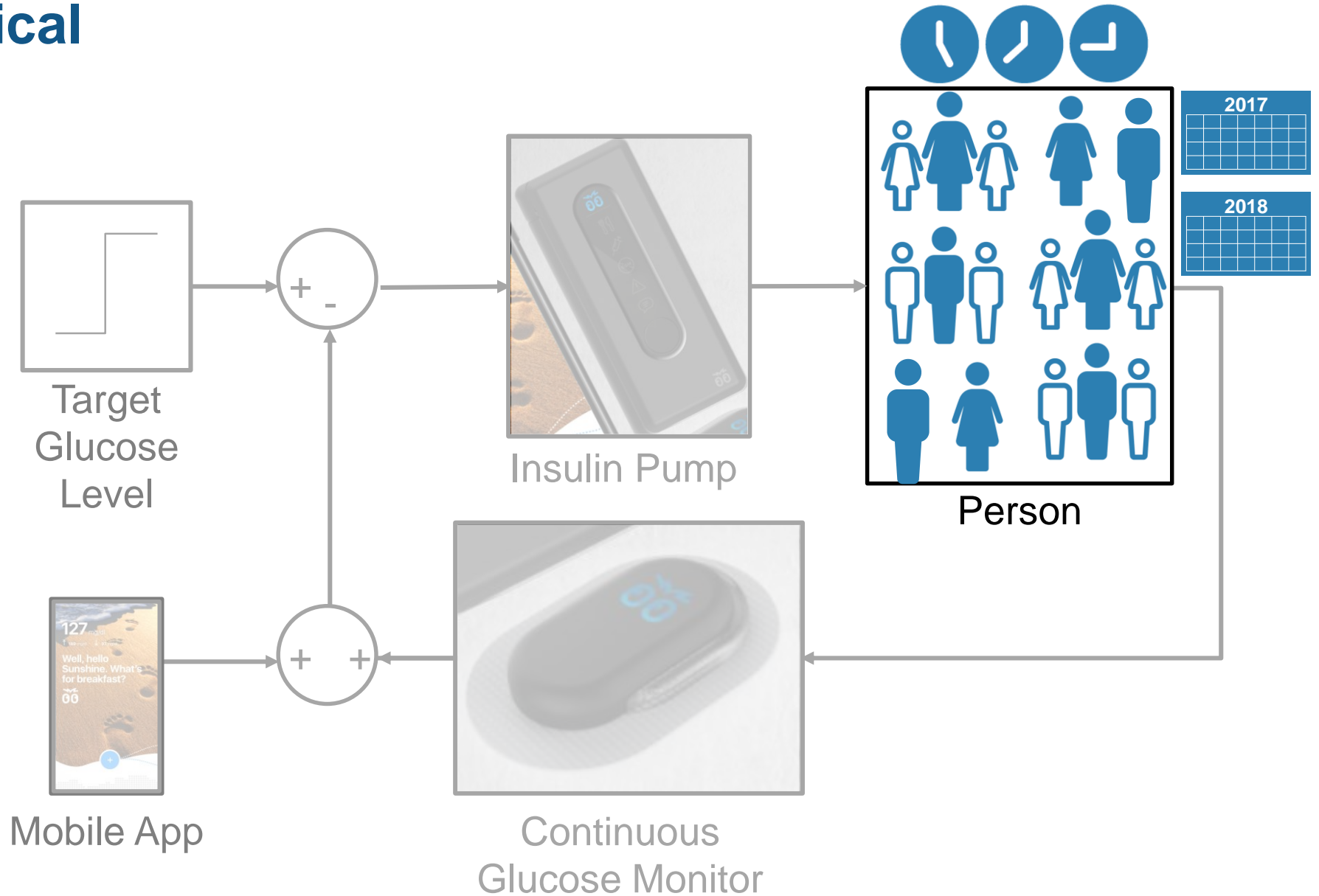
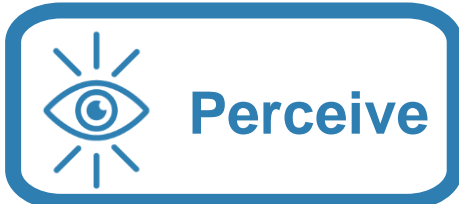
# Autonomous Glucose Level Management

## Bigfoot Biomedical



# Autonomous Glucose Level Management

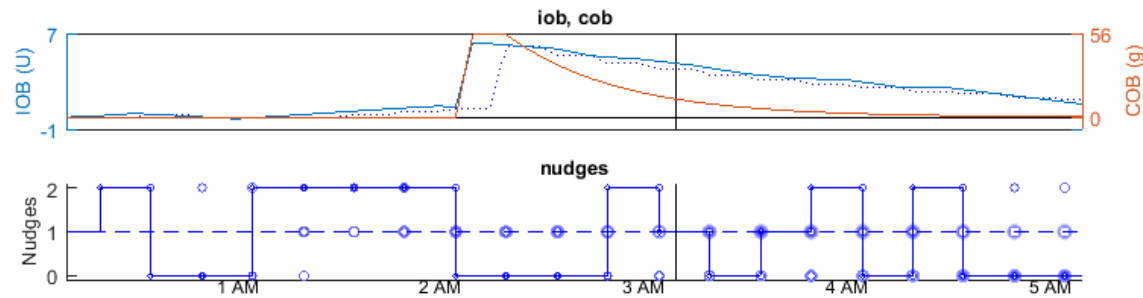
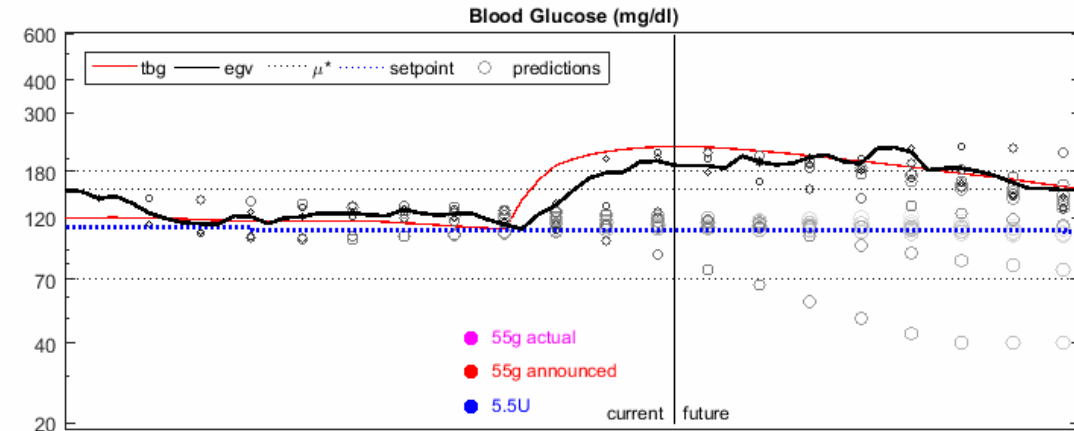
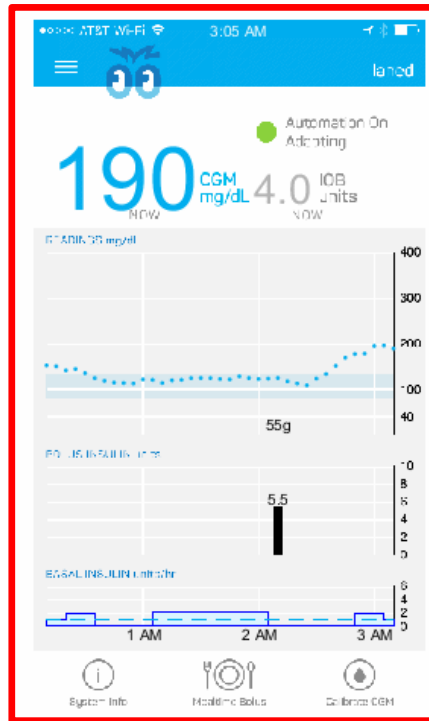
## Bigfoot Biomedical



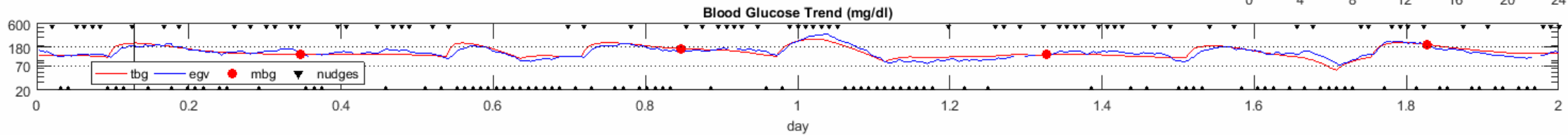
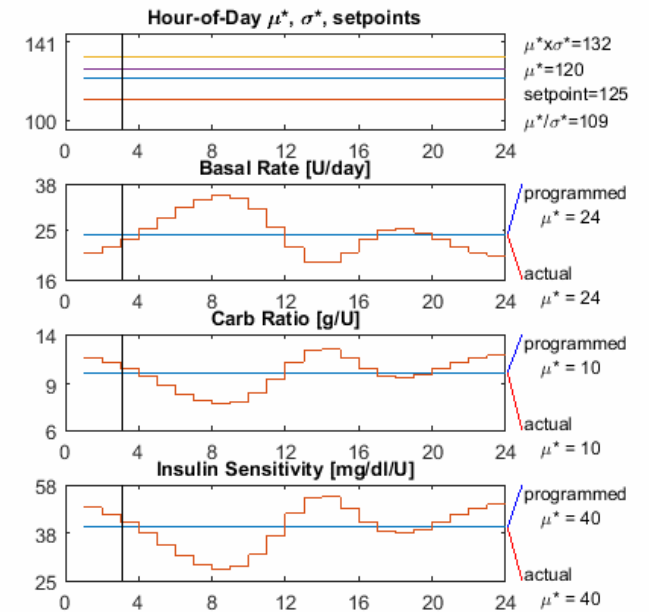


# Virtual Clinic

## Generating data through simulation

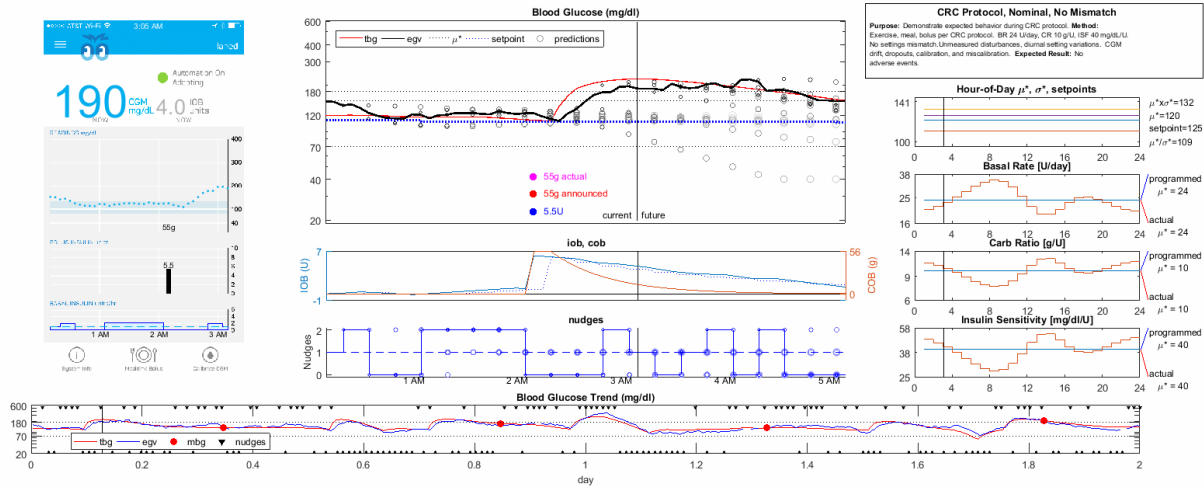


**CRC Protocol, Nominal, No Mismatch**  
**Purpose:** Demonstrate expected behavior during CRC protocol. **Method:** Exercise, meal, bolus per CRC protocol. BR 24 U/day, CR 10 g/U, ISF 40 mg/dL/U. No settings mismatch. Unmeasured disturbances, diurnal setting variations. CGM drift, dropouts, calibration, and miscalibration. **Expected Result:** No adverse events.



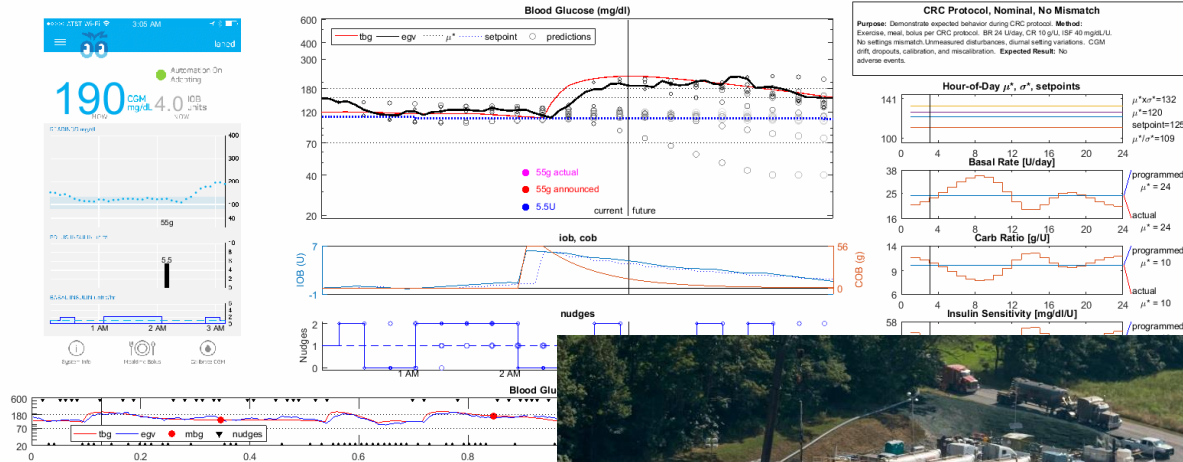
# Virtual Clinic

## Scaling computations to simulate 50 million patients a day



# Where will you get your data?

- Simulation
- Public repositories
- In the lab
- In the field
- Internet of Things (IoT)

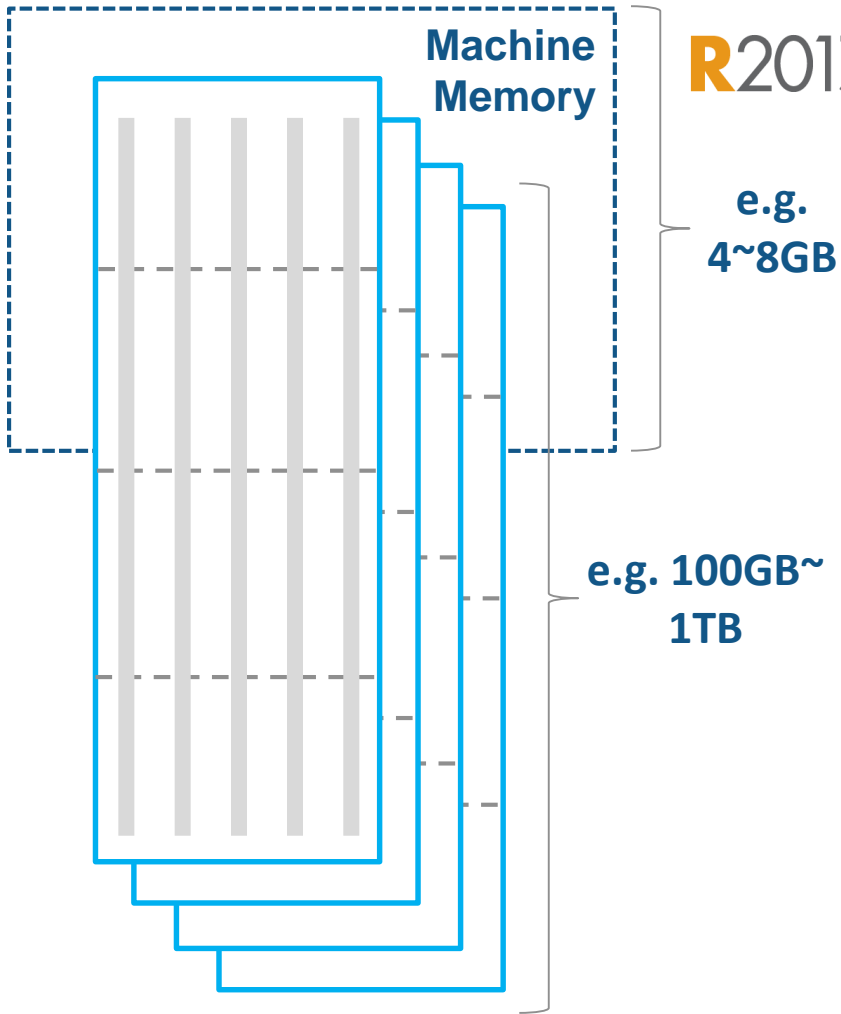


# Working with Big Data Just Got Easier

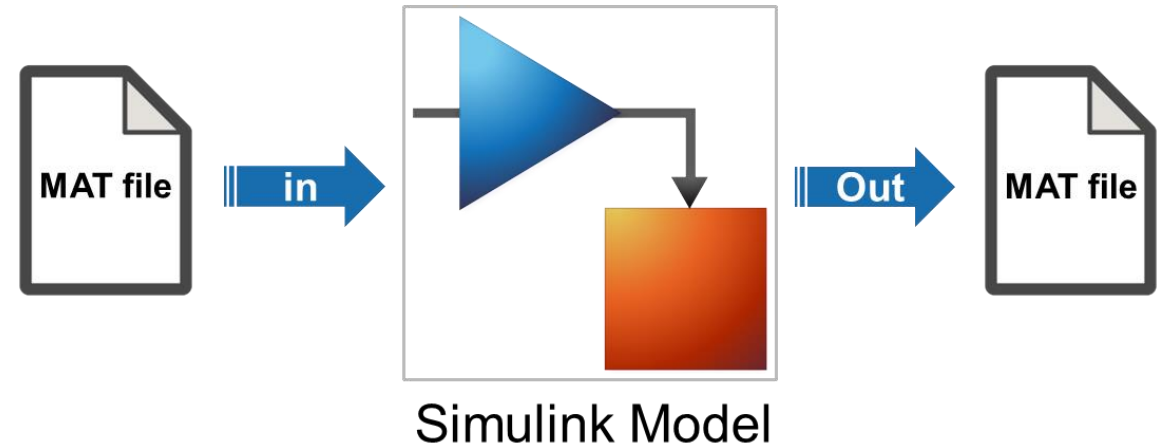
## Tall arrays in MATLAB

R2016b

R2017a



Tall Data



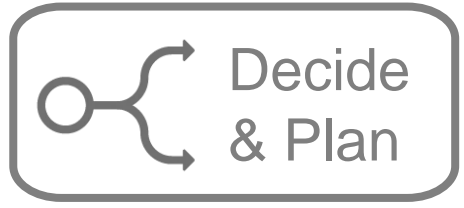
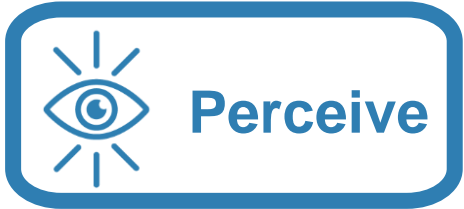
Stream large input signals from MAT-files

R2017a

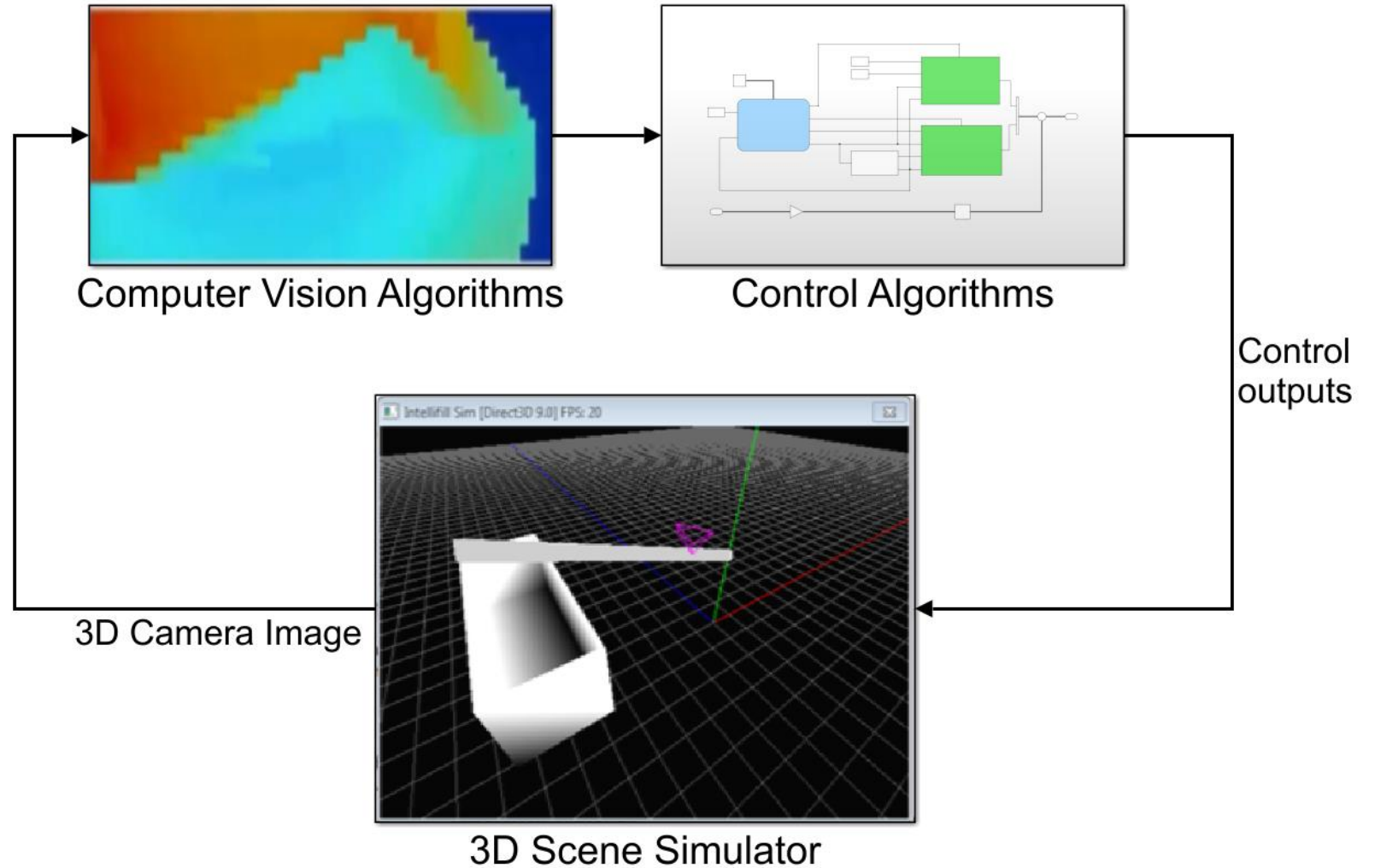
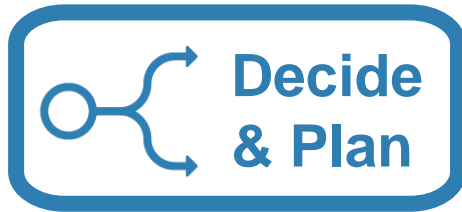




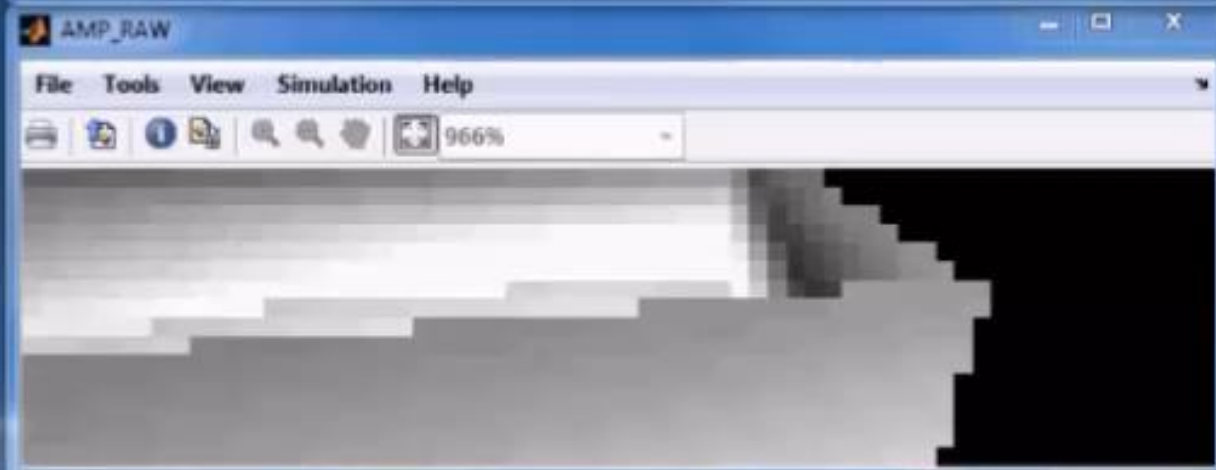
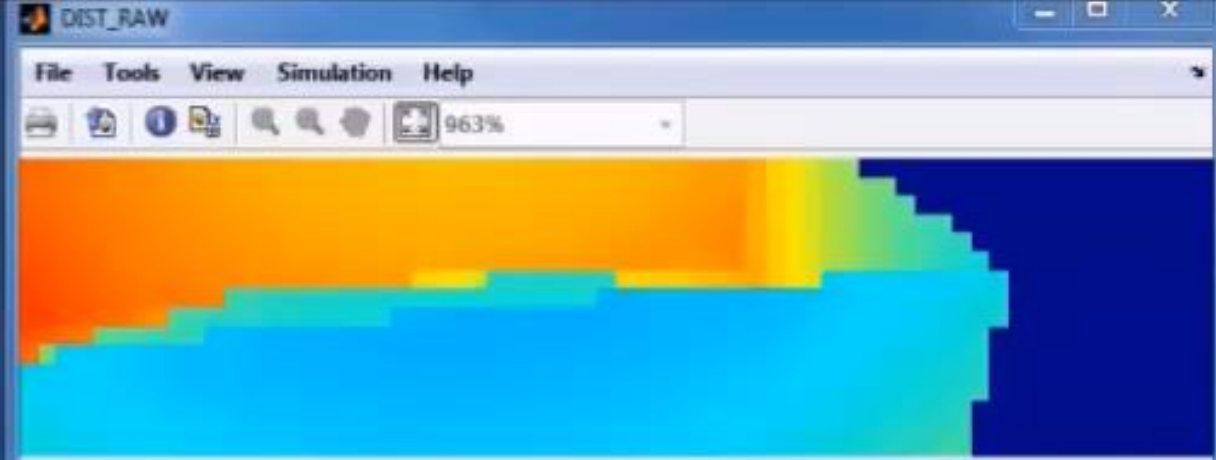
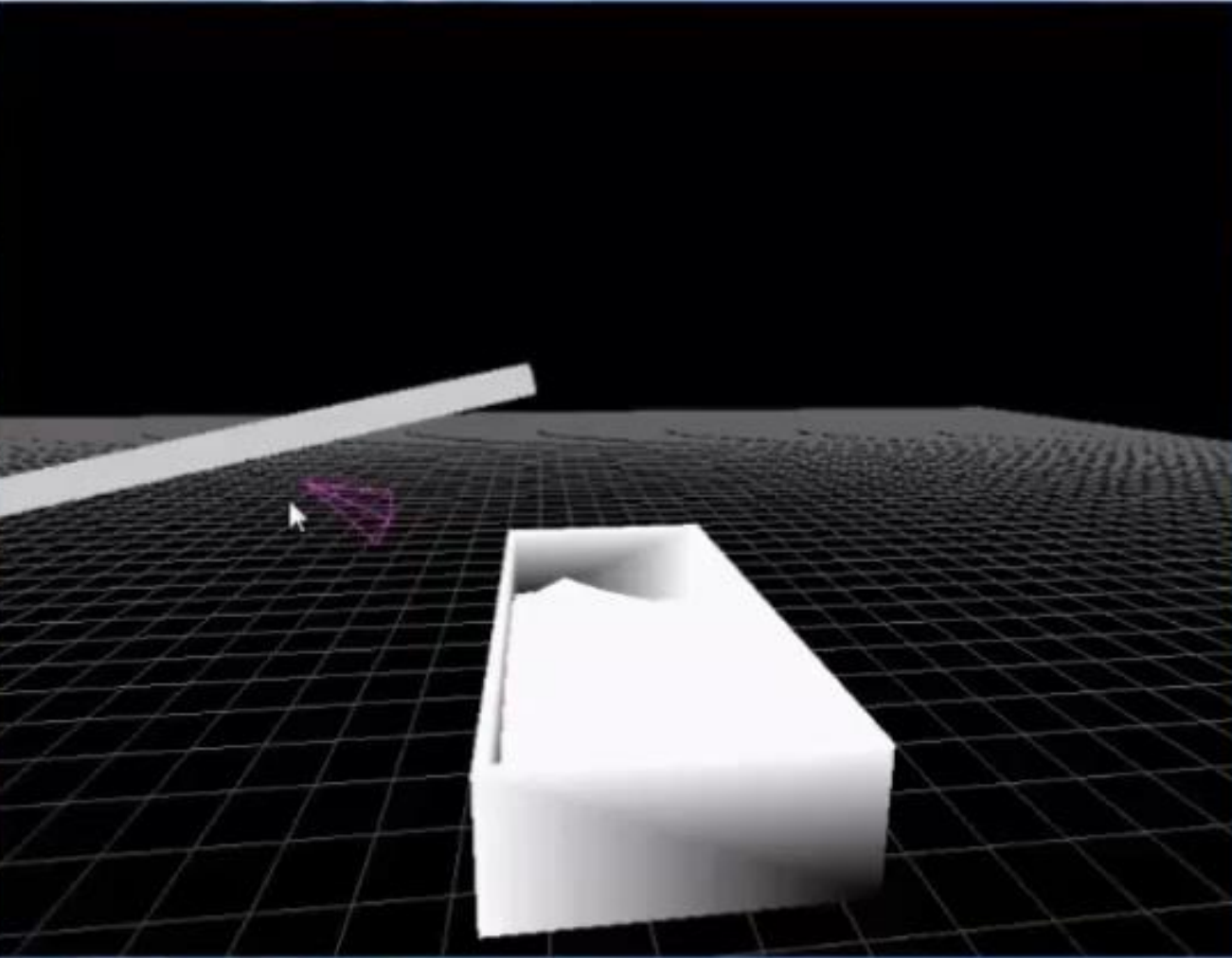
# Autonomous Trailer Filling



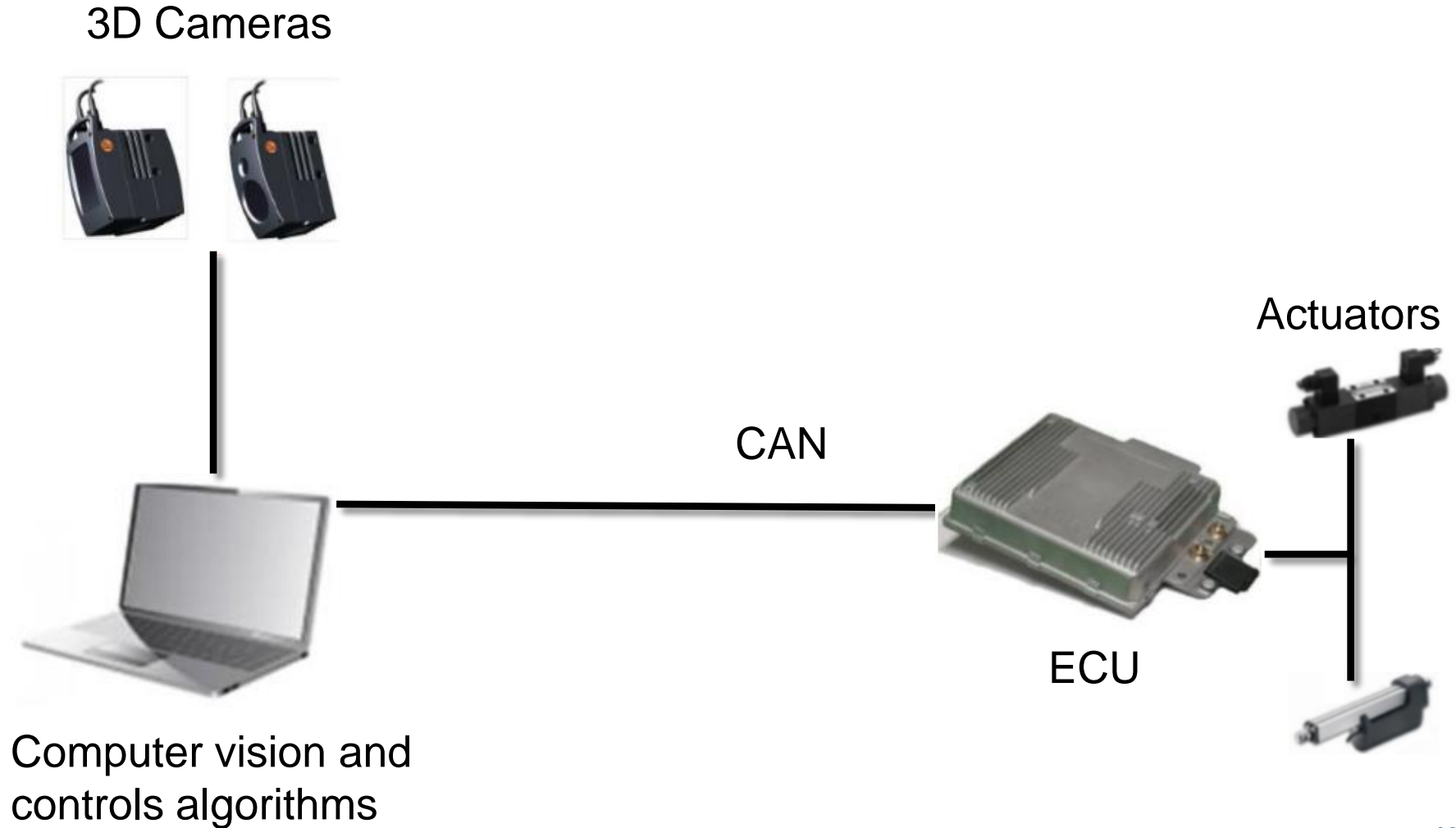
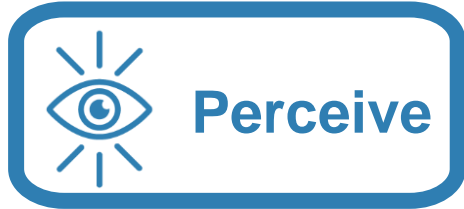
# Autonomous Trailer Filling



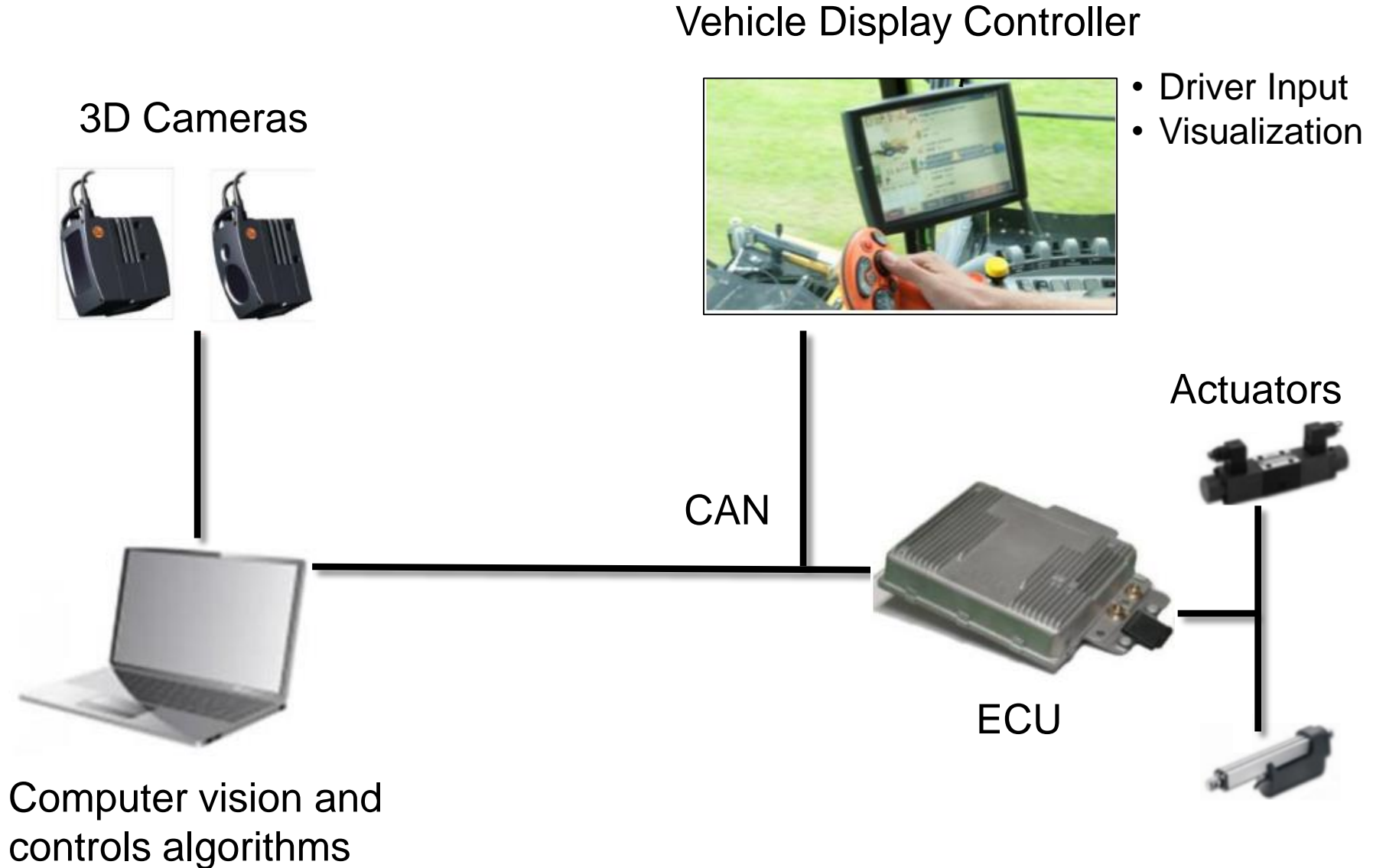
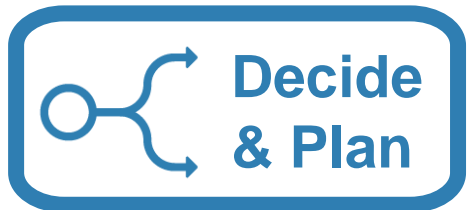
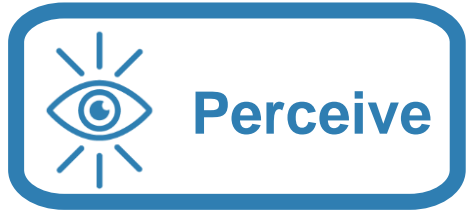




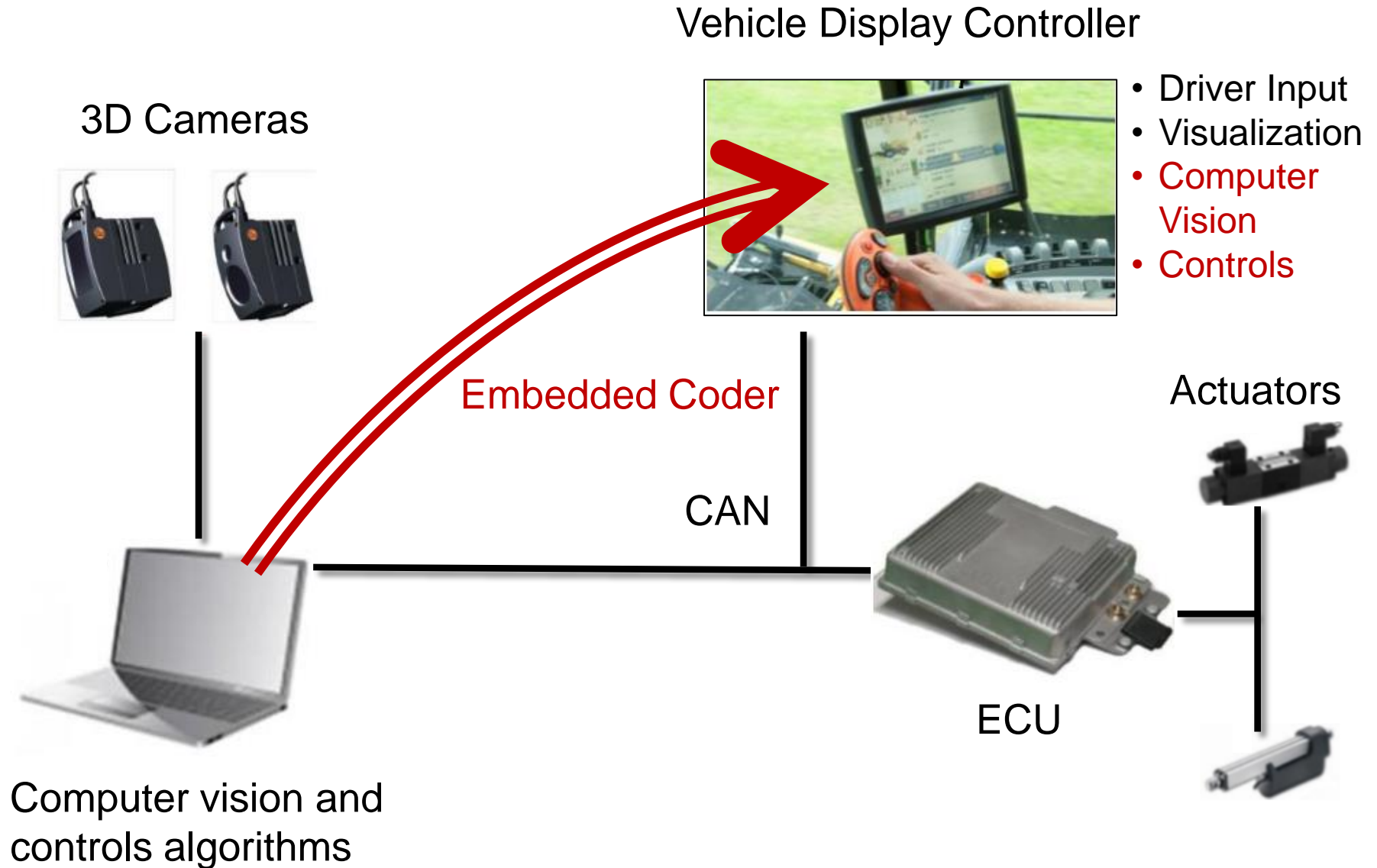
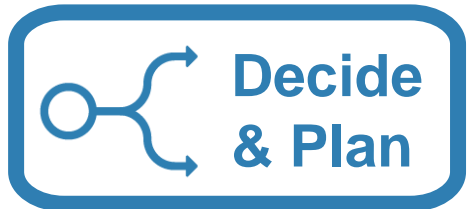
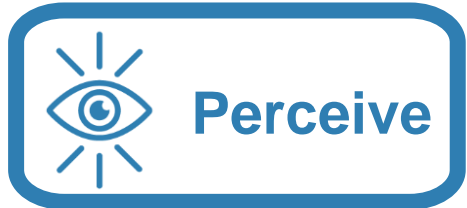
# Autonomous Trailer Filling



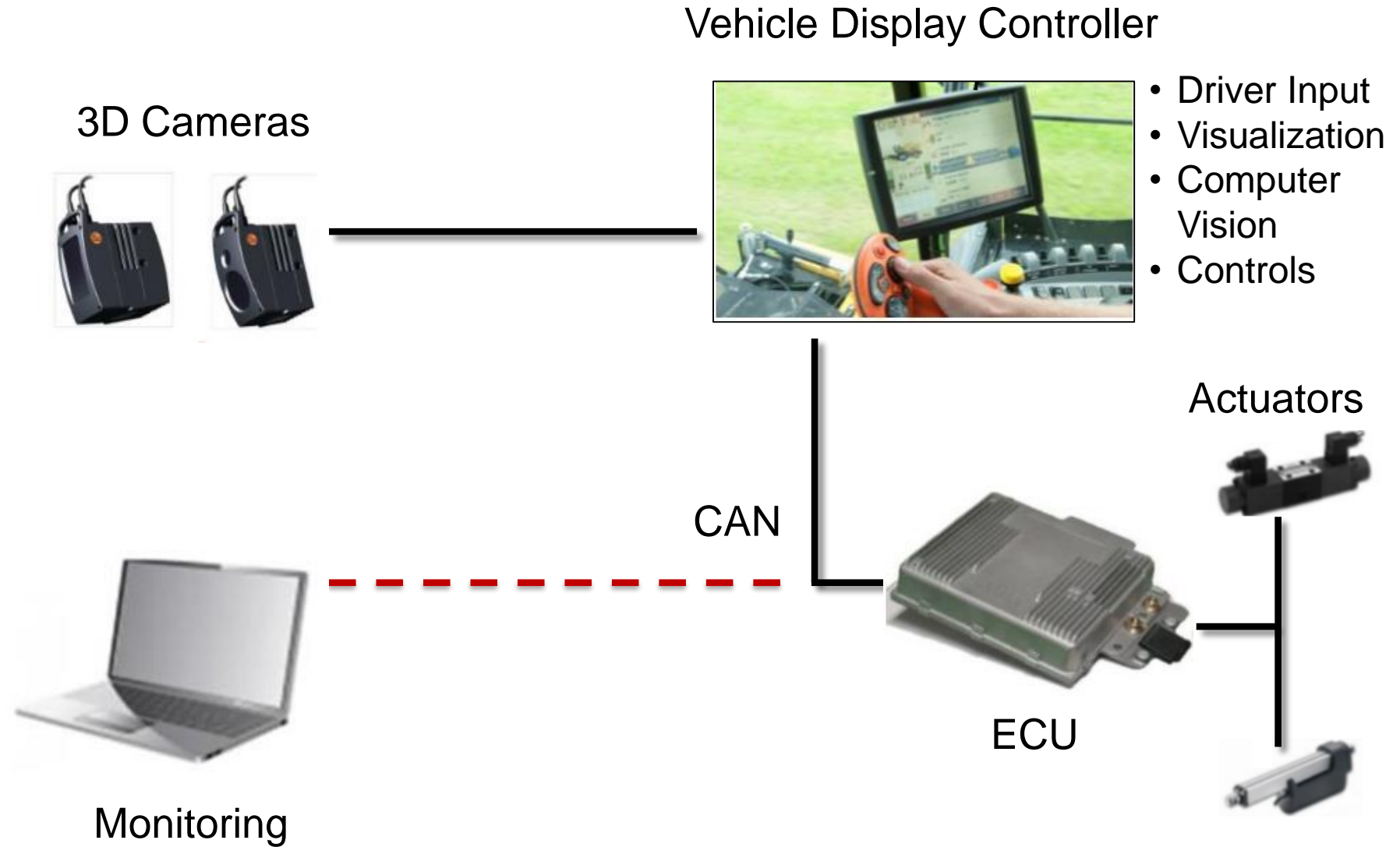
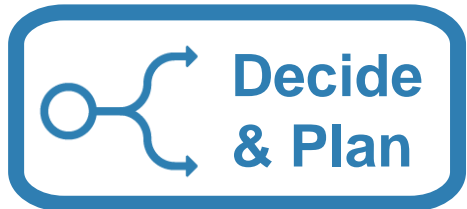
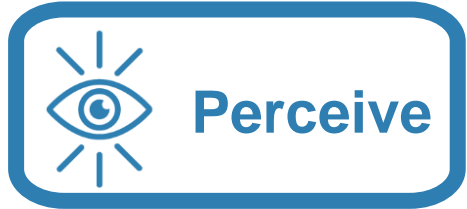
# Autonomous Trailer Filling



# Autonomous Trailer Filling



# Autonomous Trailer Filling



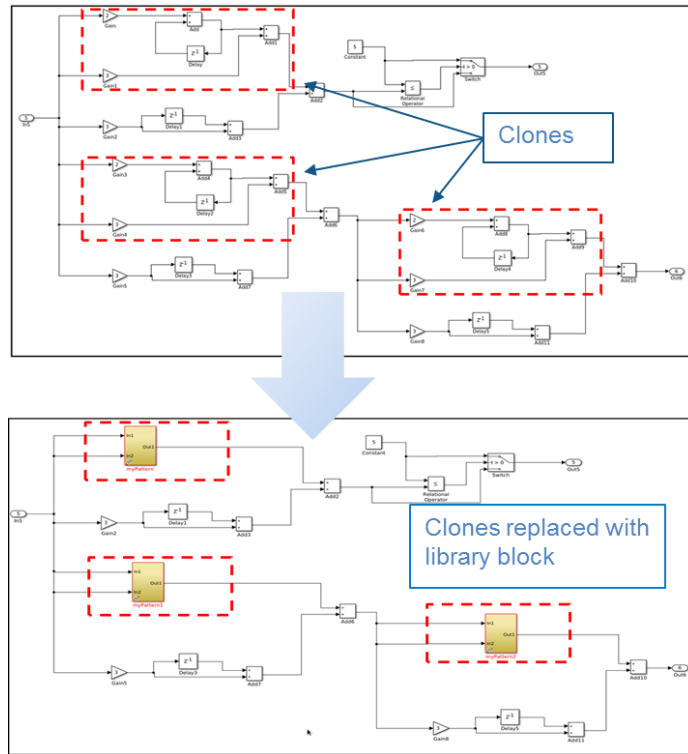
# How will you put it into production?

- Embedded Systems
- IT Systems
- Cloud
- Desktop Apps



# Investments in Model-Based Design

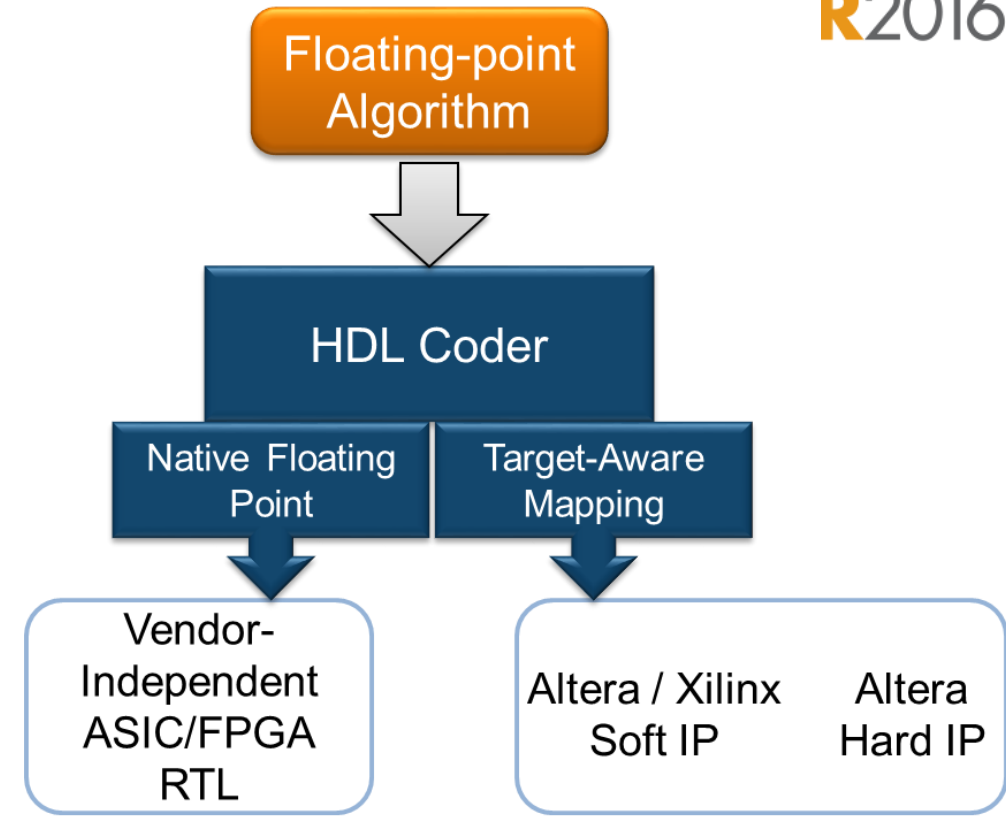
## Efficient code generation



R2017a

## Floating-point HDL code generation

R2016b



# Investments in Model-Based Design

## Code verification in support of CERT C standard



Find defects all

- Data flow
- Resource manage
- Programming
- Object oriented
- Concurrency
- Security
- Tainted data

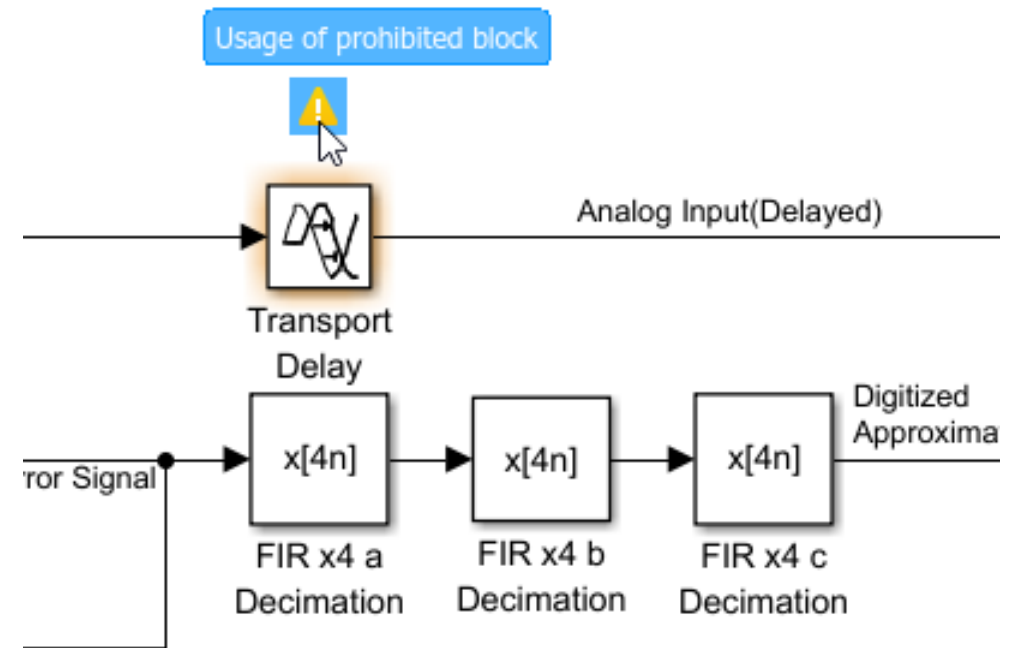
```

if (output v7 >= 0) {
    saved_values[output v7] = s8_ret;
    return s8_ret;
}
return reset_temp;
    
```

Assignment to element of static array (int 16): [-32 .. 112]  
array size: 127  
array index value: [0 .. 555]

CERT C	Description	Polyspace Code Prover
ARR30-C	Do not form or use out-of-bounds pointers or array subscripts	Array access out of bounds

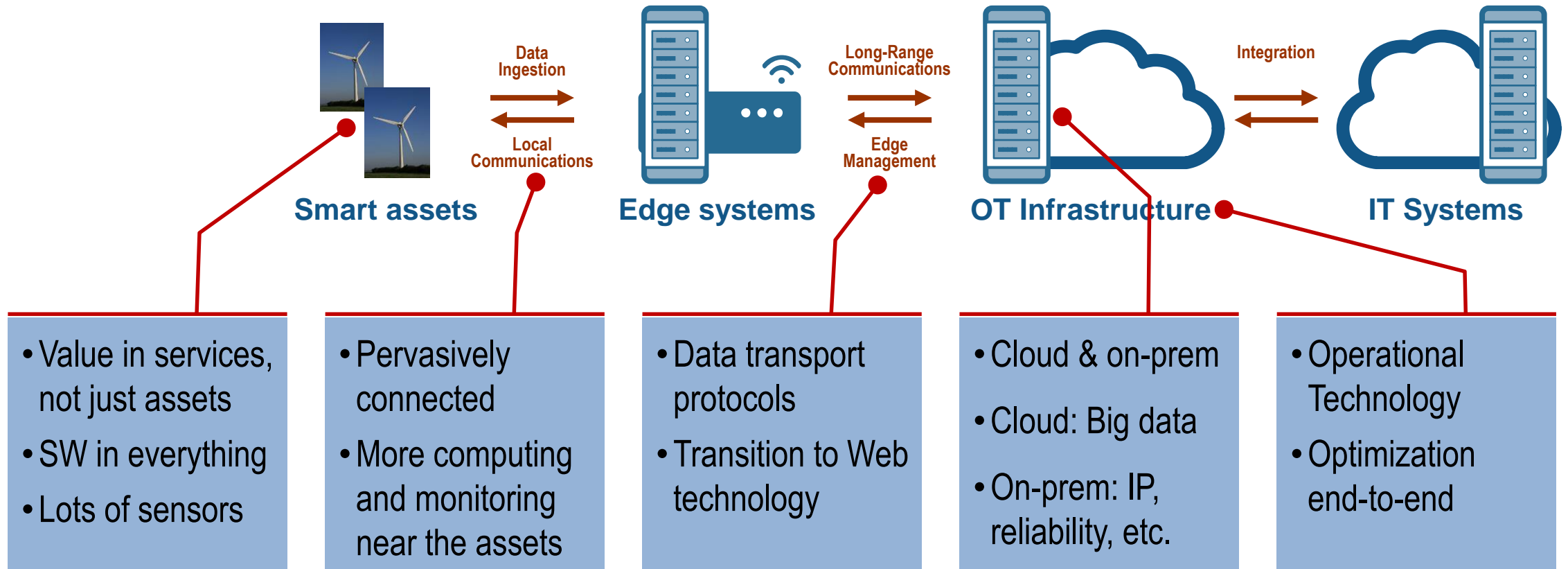
## Detect and fix standards compliance issues at design time



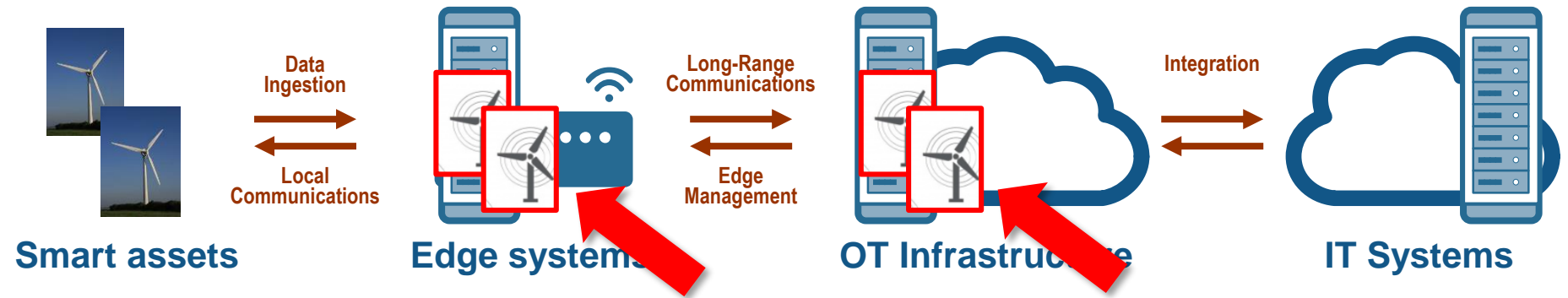
R2016b



# Connected Physical Assets in Operation



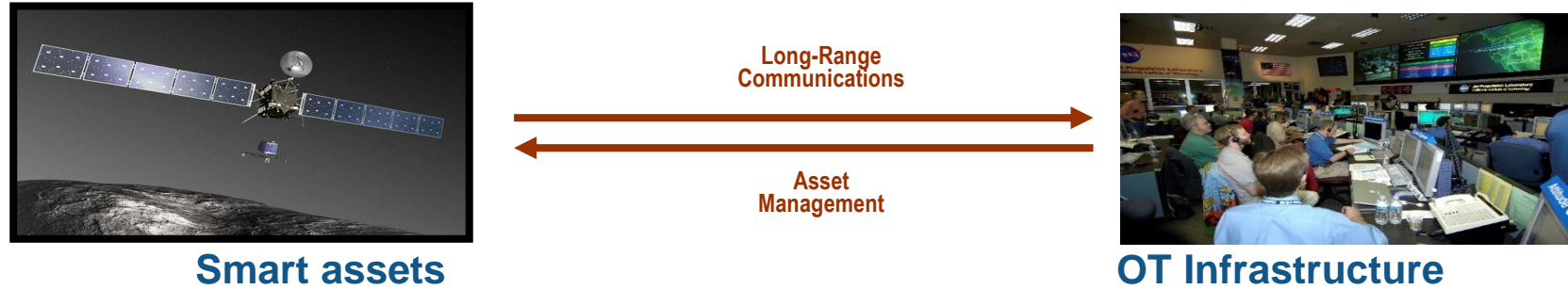
# Automation through Digital Twins



***Digital Twin: Composite of artifacts that characterize and predict behavior of a specific real asset.***

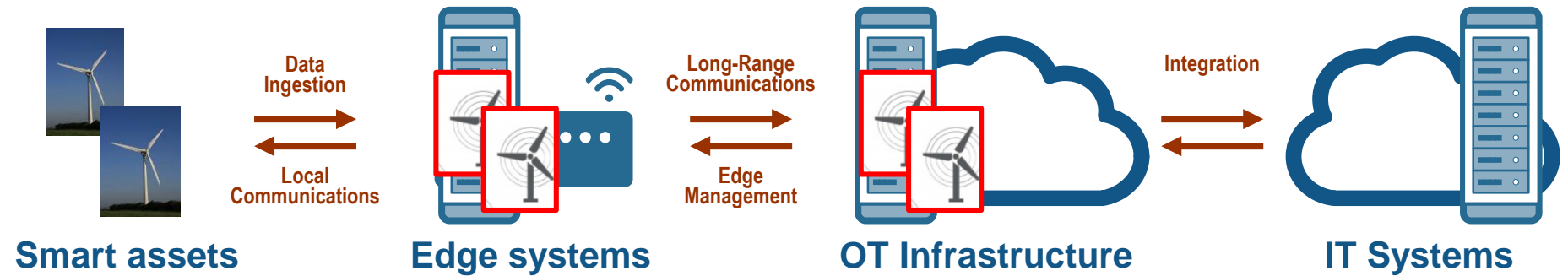


# “Digital Twin” isn’t a new concept...



Digital Twin concept has been used for a long time, especially when there is a small number of expensive assets and when reliability is critical (e.g., spacecraft, aircraft engines). The infrastructure has been one-off.

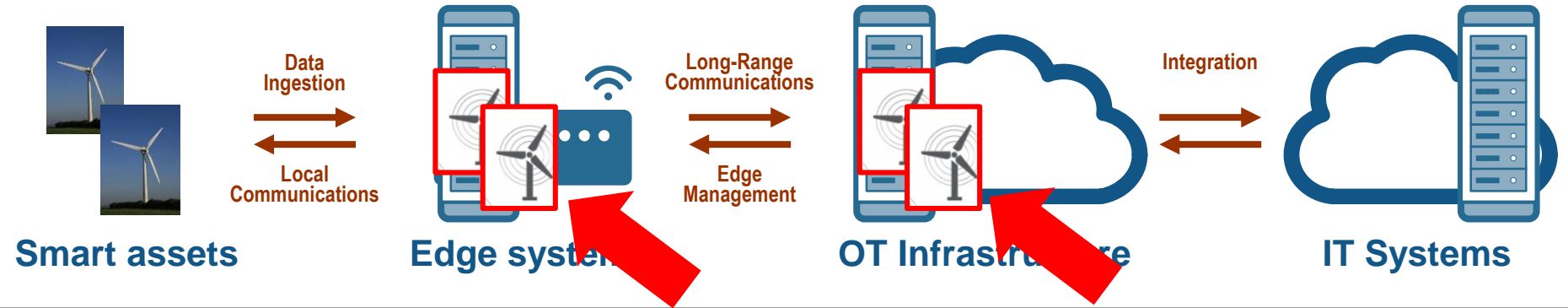
# Re-imagining the Digital Twin



Digital Twin:

- models (dynamic, FEM, data-driven, etc.) and data
- for each asset (e.g., system, component, or system of systems)
- performance and conditions over the asset's history.
- continuously updated as the asset is operated.
- always represents a faithful representation of the current state of the asset.

# MATLAB and Simulink for Digital Twins: Key Capabilities



**Multi-domain system modeling**

**Parameter estimation**

**Control design and analysis**

**Automatic code generation**

**Variety and Volumes of Data**

**Optimization**

**Machine Learning and Deep Learning**

**Enterprise system integration, with cluster/cloud execution**

# MATLAB and Simulink for Digital Twins throughout the lifecycle



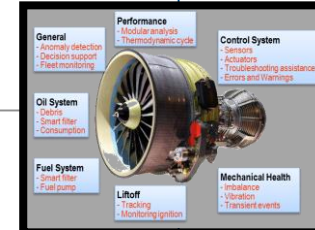
*Wind farm planning*



*Ensuring power grid reserves*



*Cloud-based HVAC optimization*



*Engine prognostics & health monitoring*



*Future car infrastructure*



*Automatic braking systems*



*Asteroid rendezvous*

System

Process

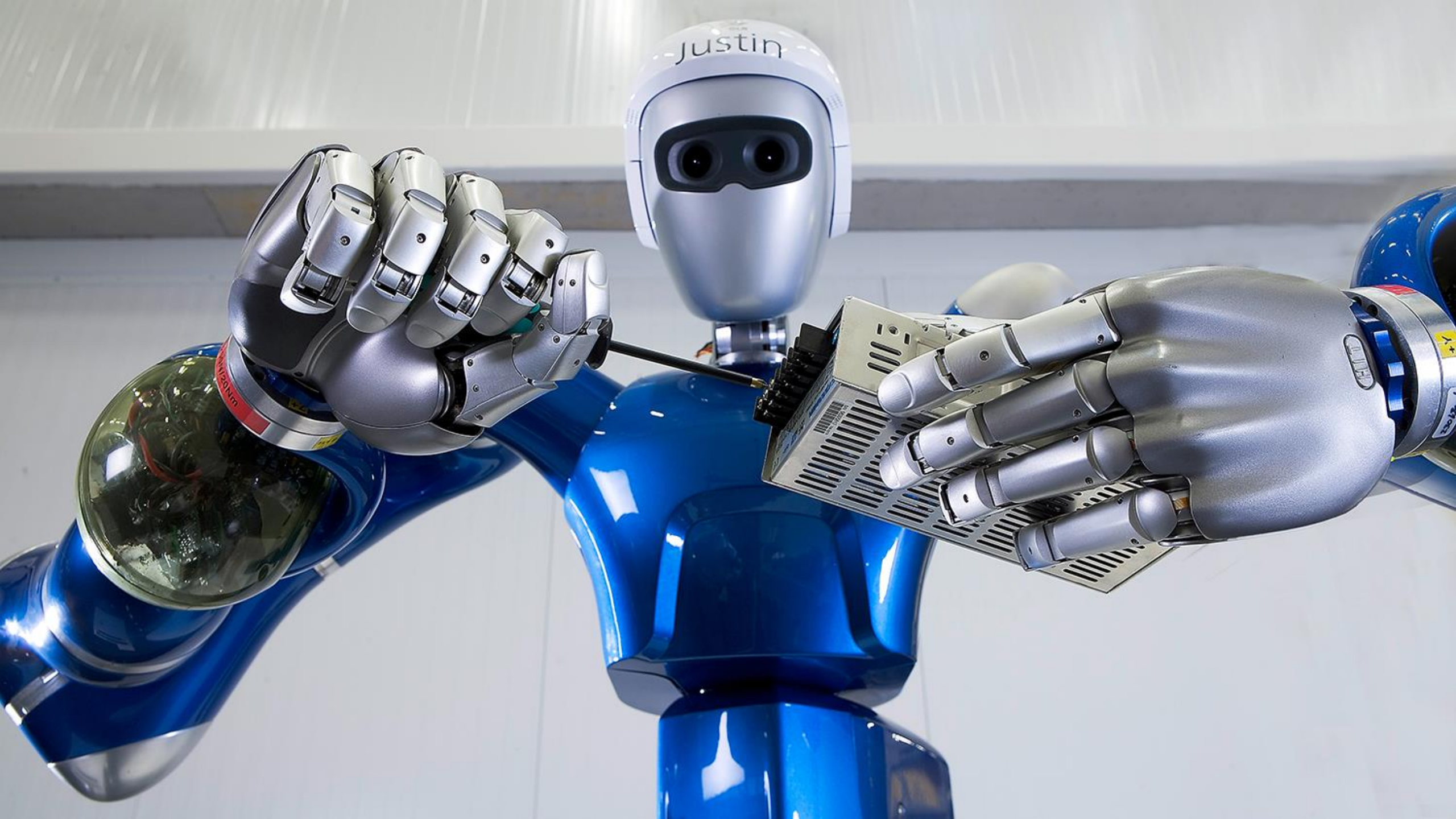
Product

Planning

Development

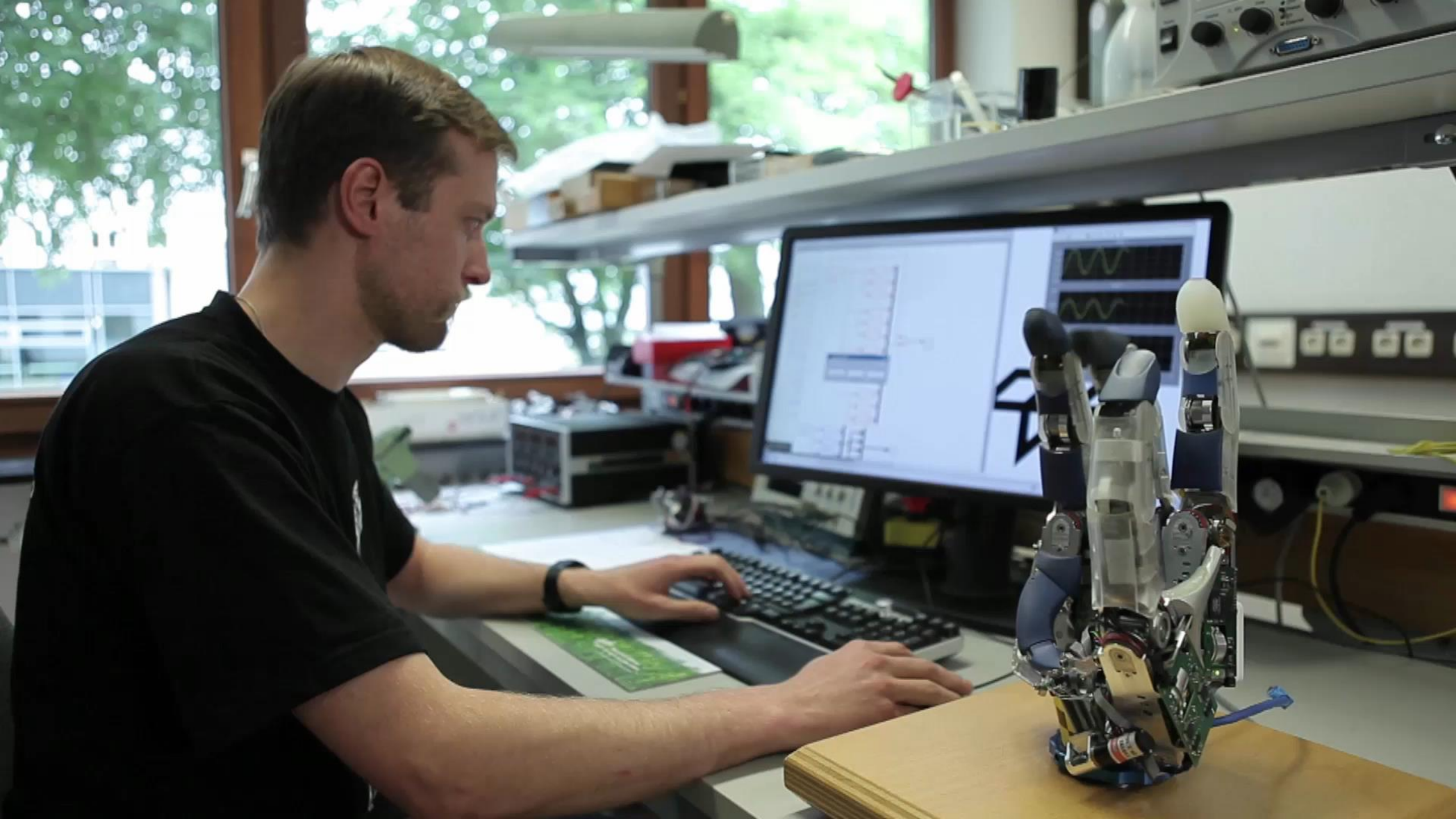
Operation

Maintenance

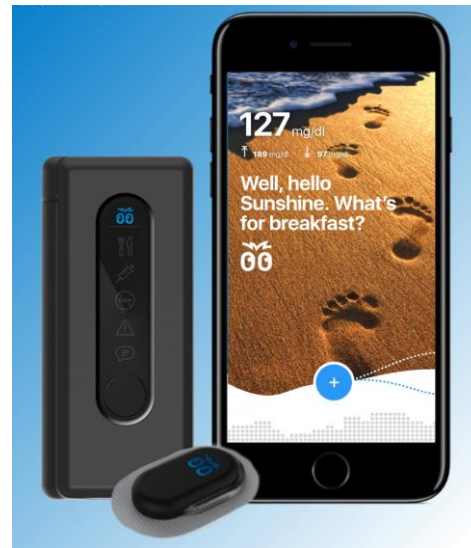
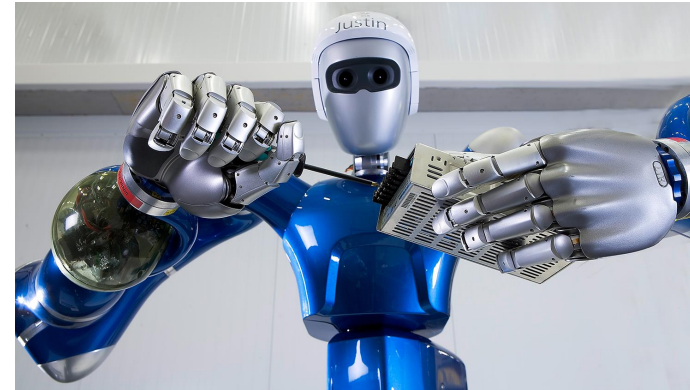
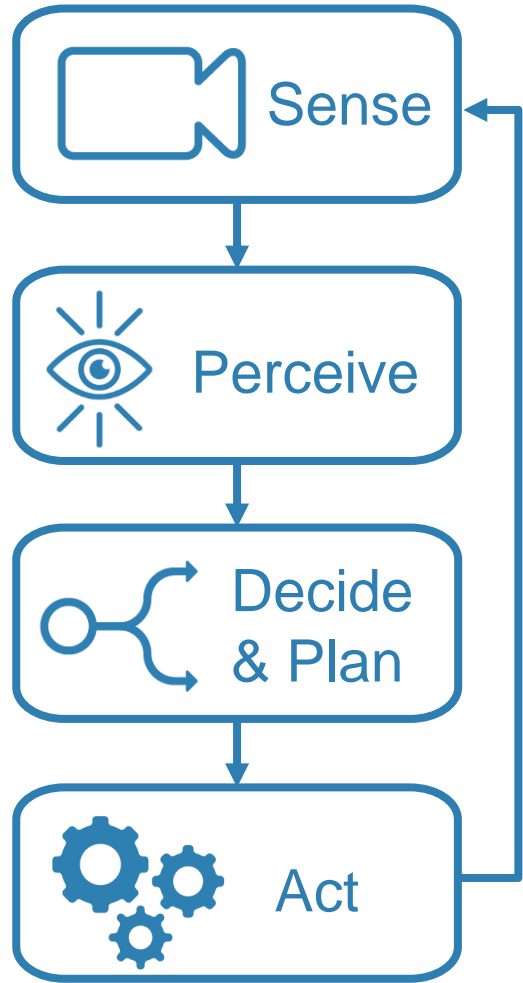








# Capabilities of an Autonomous System



# How to build an autonomous anything

## Focus on Perception

- Look for autonomy in creative places
  - Do more than manually possible
- 

## Use the Best Predictors

- Data-driven
  - Model-driven
- 

## Get the Right Data

## Go to Production

# How to build an autonomous anything

## Focus on Perception

- Look for autonomy in creative places
  - Do more than manually possible
- 

## Use the Best Predictors

- Data-driven
  - Model-driven
- 

## Get the Right Data

- Reduce to actionable data
  - Take advantage of Big Data
  - Use simulation to supplement available data
- 

## Go to Production

- Address the architecture
- Leverage Model-Based Design for embedded
- Automate integration with enterprise IT systems

What is *your*  
autonomous anything?