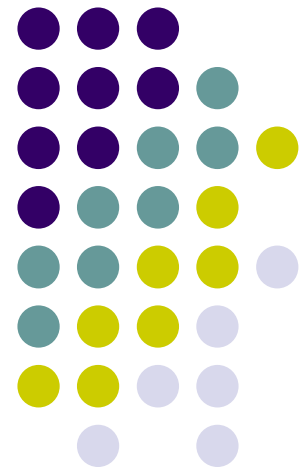


**CS 528 Mobile and Ubiquitous  
Computing  
MATLAB Machine Learner App**

**Emmanuel Agu**





## Agenda

- Machine Learning
  - What is Machine Learning and why do we need it?
  - Common challenges in Machine Learning
- Example 1: Human activity learning using mobile phone data
  - Learning from sensor data
- Example 2: Real-time car identification using images
  - Learning from images
- Summary & Key Takeaways



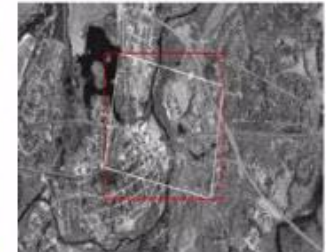
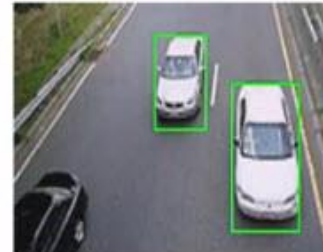
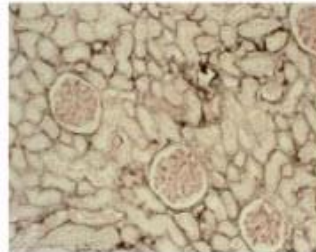
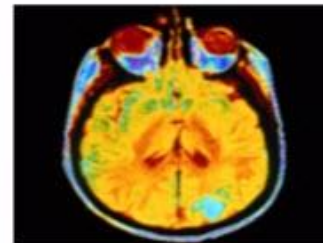
## Agenda

- Machine Learning
  - What is Machine Learning and why do we need it?
  - Common challenges in Machine Learning
- Example 1: Human activity learning using mobile phone data
  - Learning from sensor data
- Example 2: Real-time car identification using images
  - Learning from images
- Summary & Key Takeaways



## Machine Learning is Everywhere

- Image Recognition
- Speech Recognition
- Stock Prediction
- Medical Diagnosis
- Data Analytics
- Robotics
- and more...



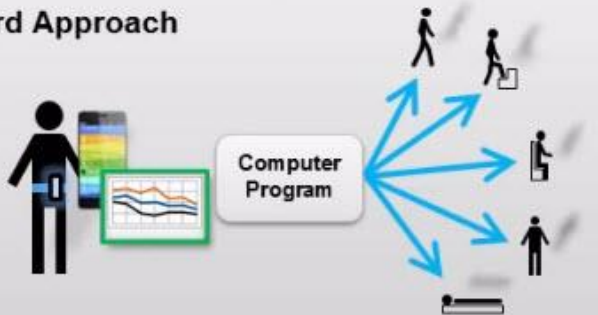


# Machine Learning

Machine learning uses **data** and produces a **program** to perform a **task**

**Task:** Human Activity Detection

## Standard Approach



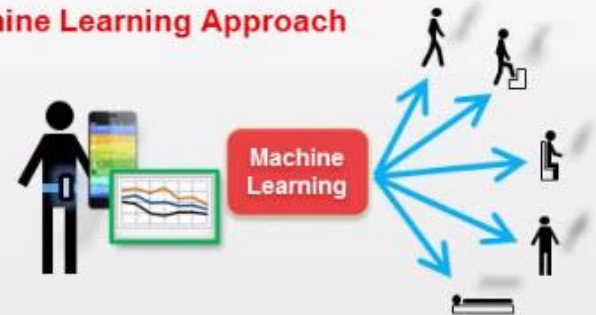
Hand Written Program

If  $X_{acc} > 0.5$   
then "SITTING"  
If  $Y_{acc} < 4$  and  $Z_{acc} > 5$   
then "STANDING"  
...

Formula or Equation

$$Y_{activity} = \beta_1 X_{acc} + \beta_2 Y_{acc} + \beta_3 Z_{acc} + \dots$$

## Machine Learning Approach

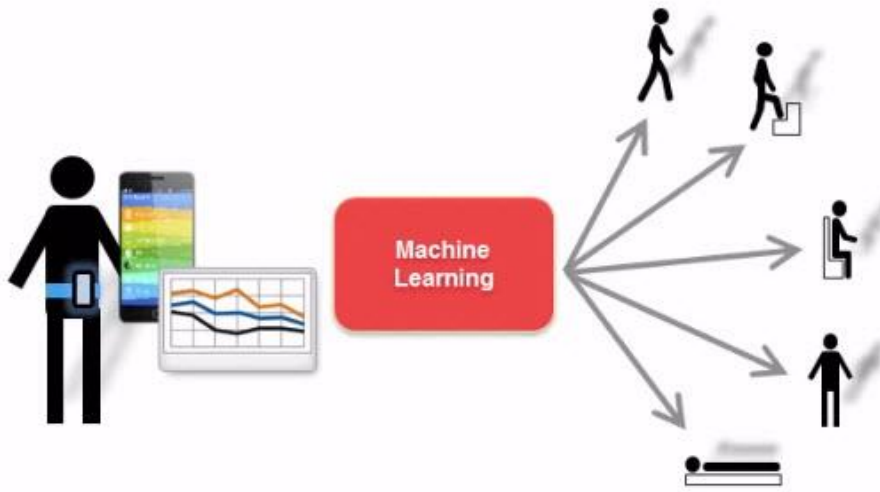


*model*: Inputs → Outputs

$$model = \langle \text{Machine Learning Algorithm} \rangle (sensor\_data, activity)$$

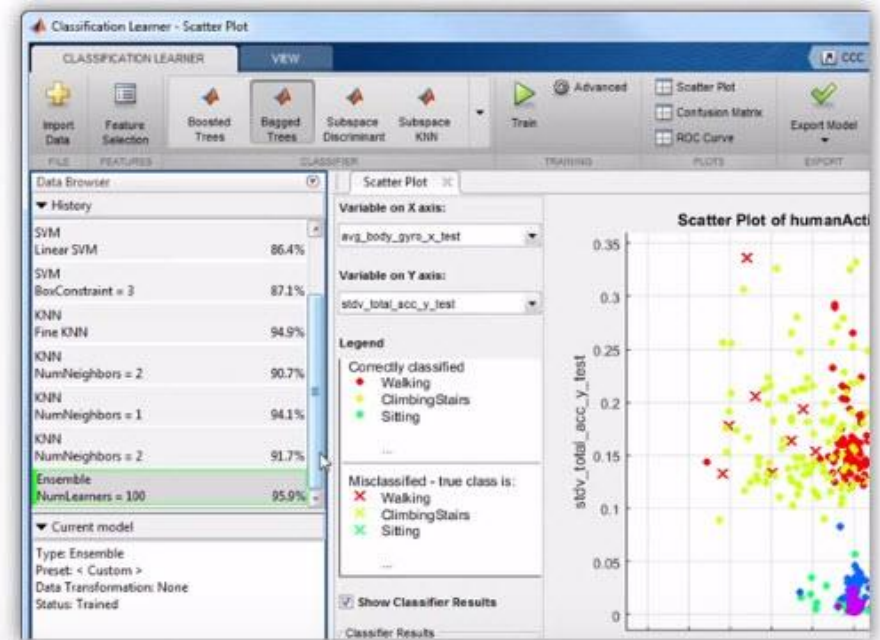


## Example: Human Activity Learning Using Mobile Phone Data

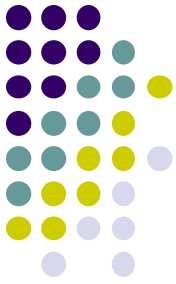


Data:

- 3-axial Accelerometer data
- 3-axial Gyroscope data







Classification Learner - Scatter Plot

CLASSIFICATION LEARNER VIEW

Import Data Feature Selection Coarse KNN Cosine KNN Cubic KNN Weighted KNN Train Advanced Scatter Plot Confusion Matrix ROC Curve Export Model

FILE FEATURES CLASSIFIER TRAINING PLOTS EXPORT

Data Browser

▼ History

SVM	
Linear SVM	89.0%
SVM	
Quadratic SVM	93.2%
SVM	
Fine Gaussian SVM	91.0%
SVM	
Medium Gaussian SVM	93.8%
KNN	
Fine KNN	94.6%
KNN	
Medium KNN	92.5%
KNN	
Cosine KNN	93.3%
KNN	
Weighted KNN	93.8%

▼ Current model

Type: k-Nearest Neighbor  
Preset: Weighted KNN  
Data Transformation: None  
Status: Trained

Scatter Plot

Variable on X axis: Wmean\_total\_acc\_x\_train

Variable on Y axis: Wmean\_total\_acc\_y\_train

Legend

Correctly classified

- Laying
- Sitting
- ClimbingStairs

Misclassified - true class is:

- Laying
- Sitting
- ClimbingStairs

Show Classifier Results

Classifier Results

Color of misclassified points represents:

True class

Scatter Plot of humanActivityDataTrain for: k-Nearest Neighbor

Wmean\_total\_acc\_y\_train

Wmean\_total\_acc\_x\_train

3:42 / 34:39

CC HD



MATLAB R2015a

HOME PLOTS APPS SHC

New Open Save Find Files Compare Go To Print Find

FILE NAVIGATE

W: Examples HumanActivity

Current Folder

- Script
  - Publish\_Human\_Activity\_Learnin...
  - OpeningExample.m
  - Human\_Activity\_Learning.m
- MAT-file
  - rawSensorData\_train.mat
  - rawSensorData\_test.mat
  - OpeningExampleData.mat

OpeningExample.m (Script)

Workspace

Name	Value
humanActivity...	2947x19 table
humanActivity...	7352x19 table
trainedClassifier	1x1 ClassificationK...

Human Activity Detection

File Edit View Insert Tools Desktop Window Help

### Human Activity Mobile Sensor Data

Accelerometer Readings ( $m \cdot s^{-2}$ )

Time (s)

Accelerometer X  
Accelerometer Y  
Accelerometer Z

Actual Activity : Walking  
Predicted Activity : ClimbingStairs

### Classifier: ClassificationKNN

Gyroscope Readings ( $rad \cdot sec^{-1}$ )

Time (s)

Gyroscope X  
Gyroscope Y  
Gyroscope Z

tyDataTest, 0.05)

Command History

5:20 / 34:39

Evaluating current section

script

CC HD

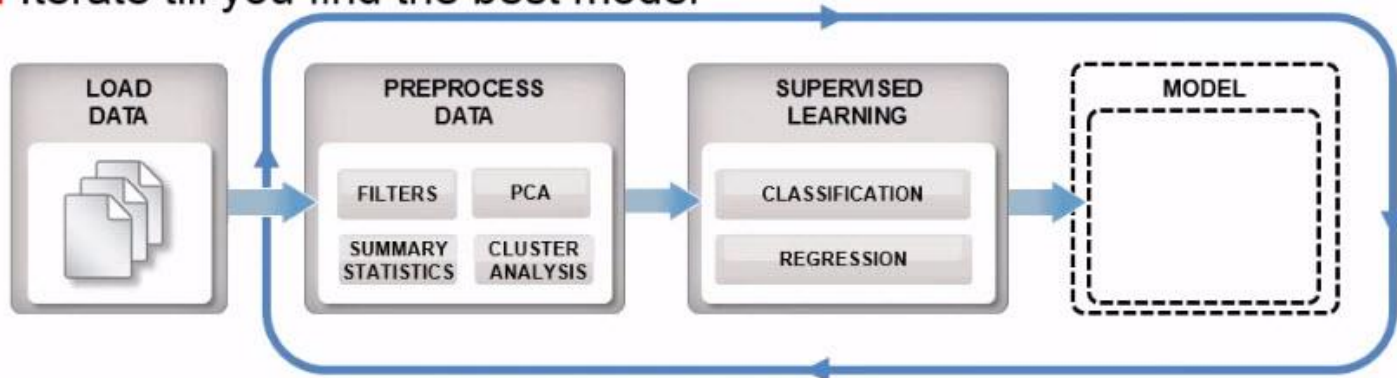
Col 37



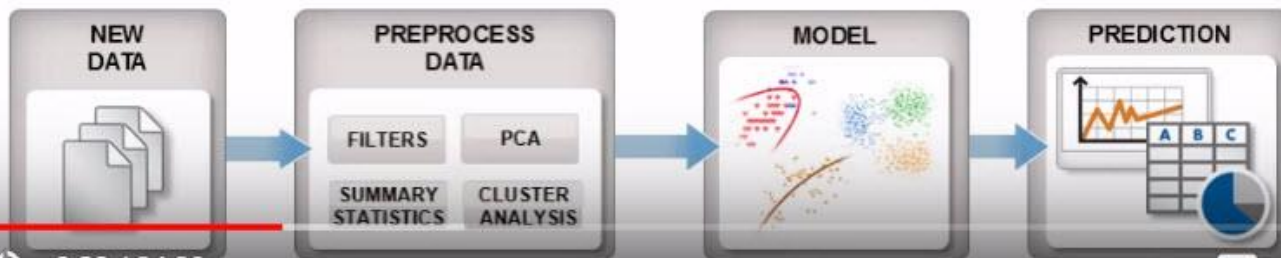


# Machine Learning Workflow

**Train:** Iterate till you find the best model



**Predict:** Integrate trained models into applications









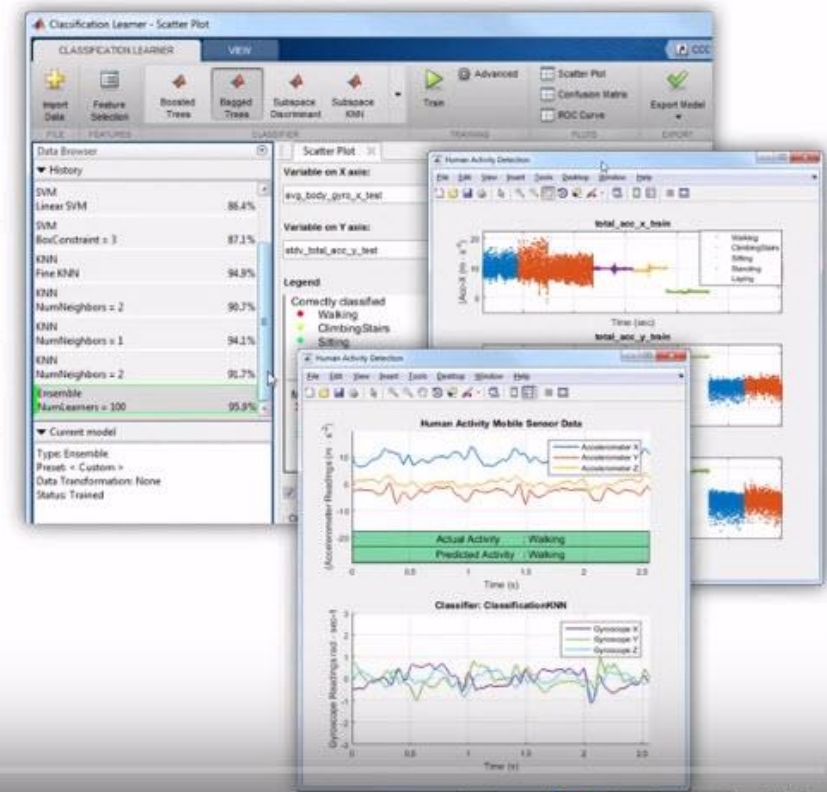


# Example 1: Human Activity Learning Using Mobile Phone Data

**Objective:** Train a classifier to classify human activity from sensor data

## Data:

Predictors	3-axial Accelerometer and Gyroscope data 
Response	Activity:     



## Approach:

- Extract features from raw sensor signals
- Train and compare classifiers
- Test results on new sensor data



MATLAB R2015a

HOME PLOTS APPS SHORTCUTS EDITOR PUBLISH VIEW

File Edit Breakpoints Run Run and Advance Run Section Run and Time

W: \Examples \HumanActivity

Current Folder

- Script
  - Publish\_Human\_Activity\_Learnin...
  - OpeningExample.m
  - Human\_Activity\_Learning.m
- MAT-file
  - rawSensorData\_train.mat
  - rawSensorData\_test.mat
  - OpeningExampleData.mat

rawSensorData\_train.mat (MAT-file)

Workspace

Name	Value
body_gyro_x_train	7352x128 double
body_gyro_y_train	7352x128 double
body_gyro_z_train	7352x128 double
total_acc_x_train	7352x128 double
total_acc_y_train	7352x128 double
total_acc_z_train	7352x128 double
trainActivity	7352x1 categorical

Editor - W:\Examples\HumanActivity\OpeningExample.m

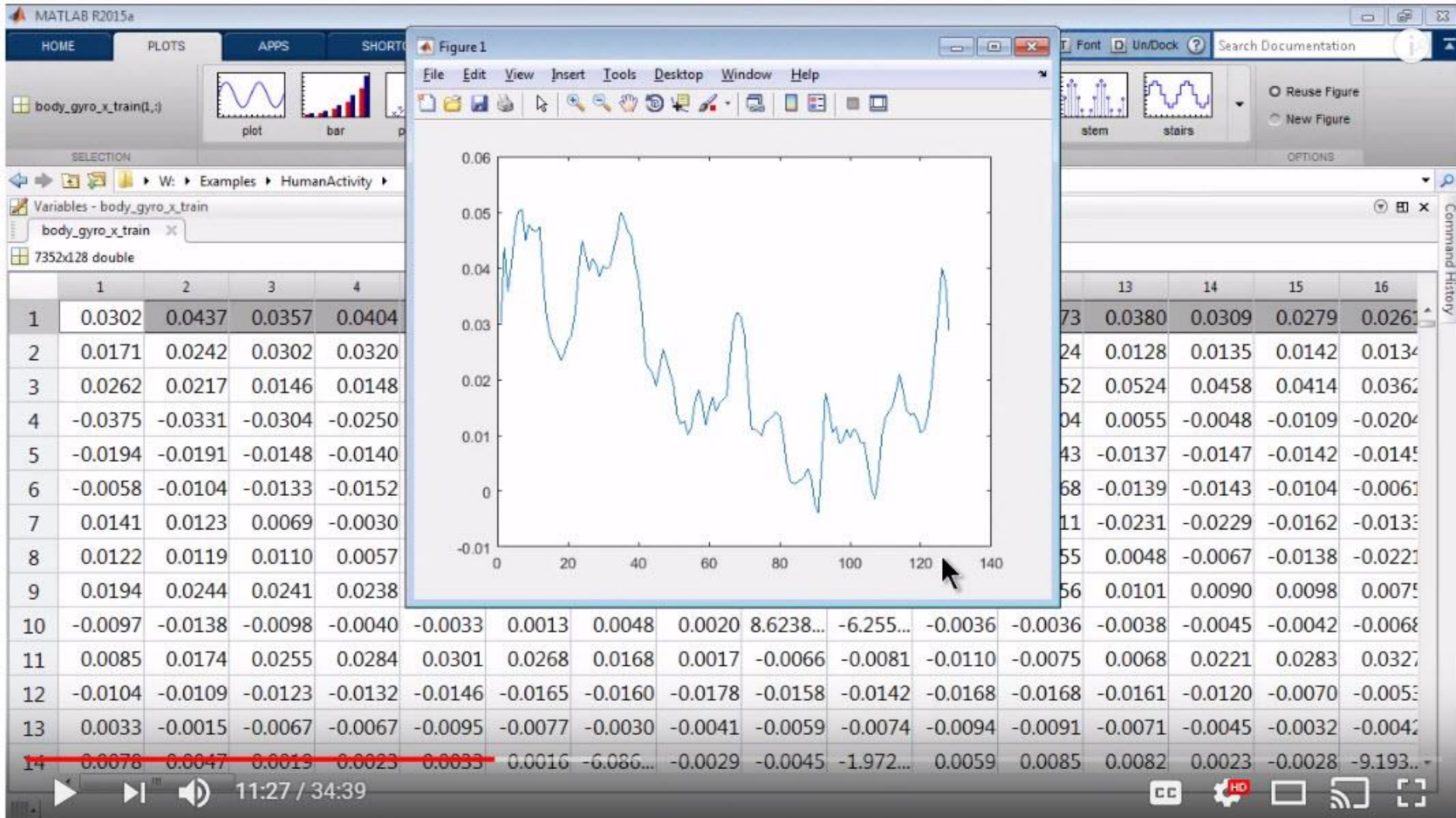
```
1 %% Opening Example
2 plotModelResults(trainedClassifier, humanActivityDataTest, 0.05)
```

Command Window

11:16 / 34:39

CC HD







Human Activity Detection

File Edit View Insert Tools Desktop Window Help

total\_acc\_x\_train

(Acc-X) ( $m \cdot s^{-2}$ )

Time (sec)

total\_acc\_y\_train

(Acc-Y) ( $m \cdot s^{-2}$ )

Time (sec)

total\_acc\_z\_train

(Acc-Z) ( $m \cdot s^{-2}$ )

Time (sec)

- Laying
- Sitting
- ClimbingStairs
- Standing
- Walking

Laying  
Sitting  
ClimbingStairs  
Standing  
Walking

```
from  
while doing  
goal of this  
that can  
measurement
```

1, ...  
1);

12:07 / 34:39

CC HD

16





MATLAB R2015a

HOME PLOTS APPS SHORTCUTS EDITOR PUBLISH VIEW

File Edit Breakpoints Run Run and Advance

W:\Examples\HumanActivity

Current Folder

- Script
  - Publish\_Human\_Activity\_Learnin...
  - OpeningExample.m
  - Human\_Activity\_Learning.m
- MAT-file
  - rawSensorData\_train.mat
  - rawSensorData\_test.mat
  - OpeningExampleData.mat

Workspace

Name	Value
body_gyro_x_train	7352x128 doubl
body_gyro_y_train	7352x128 doubl
body_gyro_z_train	7352x128 doubl
rawSensorDataTrain	7352x6 table
total_acc_x_train	7352x128 doubl
total_acc_y_train	7352x128 doubl
total_acc_z_train	7352x128 doubl

Editor - W:\Examples\HumanActivity\Human\_Activity\_Learning.m

```
17
18 %% Pre-process Training Data: *Feature Extraction*
19 % The sensor data contain windows of 2.56sec (128 readings/window)
20 % Lets start with a simple average feature for every 128 points
21
22 T_mean = varfun(@wmean, rawSensorDataTrain);
23 T_stdv = varfun(@wstd, rawSensorDataTrain);
24 T_pca = varfun(@Wpca1, rawSensorDataTrain);
25
26 humanActivityData = [T_mean, T_stdv, T_pca];
27 humanActivityData.activity = trainActivity;
28
29 %% Use the new features to train a model and assess its performance
30 classificationLearner
31
32 %% Test classifier performance on new data
33 % Step 1: Create a table
```

Command Window

13:58 / 34:39

script



MATLAB R2015a

HOME PLOTS APPS SHORTCUTS EDITOR PUBLISH VIEW

File Edit Breakpoints Run Run and Advance Advance Run and Time

W: \Examples \HumanActivity

Current Folder

- html
- Function
  - Wstd.m
  - Wpca1.m
  - Wmean.m
  - plotRawSensorData.m
  - plotModelResults.m
  - plotActivityResults.m

Workspace

Name	Value
body_gyro_x_train	7352x128 double
body_gyro_y_train	7352x128 double
body_gyro_z_train	7352x128 double
rawSensorDataTrain	7352x6 table
total_acc_x_train	7352x128 double
total_acc_y_train	7352x128 double
total_acc_z_train	7352x128 double

```
function Y = Wmean(X)
% Copyright (c) 2015, MathWorks, Inc.
    Y = mean(X, 2);
end
```

Command Window

14:06 / 34:39

28:54



MATLAB R2015a

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Search Documentation

FILE

Get More Apps Install App Package App

Current Folder

Name

- html
- Function
  - Wstd.m
  - Wpca1.m
  - Wmean.m
  - plotRawSen...
  - plotModelRe...
  - plotActivityF...

Workspace

Name

- body\_gyro\_x\_tra
- body\_gyro\_y\_tra
- body\_gyro\_z\_tra
- humanActivityD...
- rawSensorDataT
- T\_mean
- T\_pca

7352x6 table

33

Step 1: Create a table

Command Window

15:32 / 34:39

script

Command History

Search

FAVORITES

- Curve Fitting
- Classification Learner
- Distribution Fitting
- Neural Net Clustering
- Neural Net Fitting
- Neural Net Pattern Reco...
- Neural Net Time Series
- Signal Analysis
- Filter Design & Analysis
- MATLAB Coder
- Report Generator
- System Identification

MATH, STATISTICS AND OPTIMIZATION

- Classification Learner
- Curve Fitting
- Distribution Fitting
- MBC Model Fitting
- MBC Optimization
- MuPAD Notebook
- Neural Net Clustering
- Neural Net Fitting
- Neural Net Pattern Reco...
- Neural Net Time Series
- Optimization
- PDE

SIGNAL PROCESSING AND COMMUNICATIONS

- Bit Error Rate Analysis
- Eye Diagram Scope
- Filter Builder
- Filter Design & Analysis
- LTE Downlink RMC Generator
- LTE Test Model Generator
- LTE Throughput ...
- LTE Uplink RMC Generator
- Radar Equation Calculator
- Radar Waveform A...
- RF Design & Analysis
- Sensor Array Analyzer

COMPUTATIONAL FINANCE

- Financial Time Series





### Set Up Classification

**Step 1**  
Select dataset from MATLAB workspace.

- T\_mean
- T\_pca
- T\_stdv
- humanActivityData**
- rawSensorDataTrain
- body\_gyro\_x\_train
- body\_gyro\_y\_train
- body\_gyro\_z\_train
- total\_acc\_x\_train
- total\_acc\_y\_train
- total\_acc\_z\_train

Use columns as variables  
 Use rows as variables

**Step 2**  
Select predictors and response.

Name	Type	Range	Import as
Wmean_total_acc_x_train	double	-0.3707 .. 1.05533	Predictor
Wmean_total_acc_y_train	double	-0.494512 .. 1.005...	Predictor
Wmean_total_acc_z_train	double	-0.968372 .. 0.977...	Predictor
Wmean_body_gyro_x_train	double	-0.914161 .. 0.790...	Predictor
Wmean_body_gyro_y_train	double	-0.351097 .. 0.485...	Predictor
Wmean_body_gyro_z_train	double	-0.437807 .. 0.404...	Predictor
Wstd_total_acc_x_train	double	0.00134528 .. 0.6...	Predictor
Wstd_total_acc_y_train	double	0.00151609 .. 0.3...	Predictor
Wstd_total_acc_z_train	double	0.00298051 .. 0.3...	Predictor
Wstd_body_gyro_x_train	double	0.00169888 .. 1.7...	Predictor
Wstd_body_gyro_y_train	double	0.00201112 .. 1.5...	Predictor
Wstd_body_gyro_z_train	double	0.0021924 .. 0.97...	Predictor
Wpca1_total_acc_x_train	double	-13.2982 .. 2.85553	Predictor
Wpca1_total_acc_y_train	double	-5.92044 .. 11.0487	Predictor
Wpca1_total_acc_z_train	double	-12.1606 .. 10.0782	Predictor
Wpca1_body_gyro_x_train	double	-9.16752 .. 8.79436	Predictor
Wpca1_body_gyro_y_train	double	-10.0066 .. 10.9679	Predictor
Wpca1_body_gyro_z_train	double	-9.08108 .. 9.22596	Predictor
activity	categorical	5 unique	Response

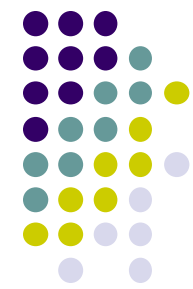
**Step 3**  
Define validation method.

Cross Validation  
Select a number of folds (or divisions) to partition the data into. Each fold is held out in turn for testing. The app trains a model for each fold using all the data outside the fold. The app tests each model performance using the data inside the fold, then calculates the average test error over all folds. This method gives a good estimate of the predictive accuracy of the final model trained with all the data. It requires multiple fits but makes efficient use of all the data.

Holdout  
Select a percentage of the data to use as a test set. The app trains the model on the training set and assesses the performance with the test set. Since the resulting model is based on only a portion of the data, it is recommended only for large data sets.

No Validation  
Use all the data for training and compute the error rate on the same data. The estimated error rate is likely to be unrealistically low. The actual error rate when the model is used to predict new data is likely to be higher.

Percent Held Out: 25



Classification Learner - Scatter Plot

CLASSIFICATION LEARNER VIEW

Import Data Feature Selection Complex Tree Medium Tree Simple Tree Linear SVM Train Advanced Scatter Plot Confusion Matrix ROC Curve Export Model

FILE Feature Selection CLASSIFIER TRAINING PLOTS EXPORT

Data Browser: Wmean\_total\_acc\_x\_train, Wmean\_total\_acc\_y\_train, Wmean\_total\_acc\_z\_train, Wmean\_body\_gyro\_x\_train, Wmean\_body\_gyro\_y\_train, Wmean\_body\_gyro\_z\_train, Wstd\_total\_acc\_x\_train, Wstd\_total\_acc\_y\_train, Wstd\_total\_acc\_z\_train, Wstd\_body\_gyro\_x\_train, Wstd\_body\_gyro\_y\_train, Wstd\_body\_gyro\_z\_train, Wpca1\_total\_acc\_x\_train

Scatter Plot

Variable on X axis: Wmean\_total\_acc\_x\_train

Variable on Y axis: Wmean\_total\_acc\_y\_train

Legend

- Observation from class
- Laying (Red)
- Sitting (Yellow)
- ClimbingStairs (Green)
- ...

Show Classifier Results

Classifier Results

< Model not trained >

Scatter Plot of humanActivityData

Wmean\_total\_acc\_y\_train

Wmean\_total\_acc\_x\_train

17:38 / 34:39

CC HD





Classification Learner - Confusion Matrix

CLASSIFICATION LEARNER VIEW

Import Data Feature Selection Complex Tree Medium Tree Simple Tree Linear SVM Train Scatter Plot Confusion Matrix ROC Curve Export Model

Data Browser

History

- Tree Simple Tree 84.4%
- Tree Medium Tree 89.8%
- Tree Complex Tree 93.0%

Current model

Type: Decision Tree  
Preset: Complex Tree  
Data Transformation: None  
Status: Trained

Overall Accuracy: 93.0%  
Overall Error: 7.0%

Summarize

- Per true class  
View percentages per true class including True Positive Rates (TPR) and False Negative Rates (FNR).
- Per predicted class  
View percentages per predicted class including Positive Predictive Values (PPV) and False Discovery Rates (FDR).
- Overall  
View percentages over the entire confusion matrix.

Confusion Matrix for: Decision Tree

True class \ Predicted class	Laying	Sitting	ClimbingStairs	Standing	Walking	TPR / FNR
Laying	282 100%	0 0.0%	0 0.0%	0 0.0%	0 0.0%	100% 0.0%
Sitting	0 0.0%	248 96.5%	0 0.0%	8 3.1%	1 0.4%	96.5% 3.5%
ClimbingStairs	0 0.0%	0 0.0%	366 89.1%	0 0.0%	45 10.9%	89.1% 10.9%
Standing	0 0.0%	20 7.3%	0 0.0%	254 92.7%	0 0.0%	92.7% 7.3%
Walking	0 0.0%	0 0.0%	29 11.8%	0 0.0%	217 88.2%	88.2% 11.8%

19:45 / 34:39

CC HD



### Classification Learner - ROC Curve

CLASSIFICATION LEARNER | VIEW

Import Data | Feature Selection | Complex Tree | Medium Tree | Simple Tree | Linear SVM | Train | Advanced | Scatter Plot | Confusion Matrix | ROC Curve | Export Model

FILE | FEATURES | CLASSIFIER | TRAINING | PLOTS | EXPORT

Data Browser | Scatter Plot | Confusion Matrix | ROC Curve

▼ History

Tree	
Simple Tree	84.4%
Tree	
Medium Tree	89.8%
Tree	
Complex Tree	93.0%

▼ Current model

Type: Decision Tree  
Preset: Simple Tree  
Data Transformation: None  
Status: Trained

**Area Under Curve**  
0.974482

**Positive class:**  
Sitting

**Negative classes:**  
Laying  
ClimbingStairs  
Standing  
Walking

#### ROC Curve for: Decision Tree

True positive rate

False positive rate

20:45 / 34:39

CC HD



Classification Learner - ROC Curve

CLASSIFICATION LEARNER VIEW

Import Data Feature Selection Medium KNN Coarse KNN Cosine KNN Cubic KNN Train

Advanced Scatter Plot

Advanced KNN Options

Number of Neighbors: 6

Distance Metric: Minkowski (Cubic)

Distance Weight: Equal

Standardize Data:

Area Under Curve: 0.997302

Positive class: Sitting

Negative classes: Laying, ClimbingStairs, Standing, Walking

ROC Curve for: k-Nearest Neighbor

True positive rate

False positive rate

21:35 / 34:39

CC HD

Model	Accuracy
Tree Simple Tree	84.4%
Tree Medium Tree	89.8%
Tree Complex Tree	93.0%
KNN Fine KNN	95.0%
KNN Medium KNN	92.0%
KNN Coarse KNN	85.8%
KNN Cosine KNN	92.5%



MATLAB R2015a

HOME PLOTS APPS SHORTCUTS EDITOR PUBLISH VIEW

Get More Apps Install App Package App Curve Fitting Classification Learner Distribution Fitting Neural Net Clustering Neural Net Fitting Neural Net Pattern Reco... Neural Net Time Series Signal Analysis Filter Design & Analysis MATLAB Coder Report Generator System Identification

W: \Examples \HumanActivity

Current Folder

- html
- Function
  - Wstd.m
  - Wpca1.m
  - Wmean.m
  - plotRawSensorData.m
  - plotModelResults.m
  - plotActivityResults.m

Workspace

Name	Value
body_gyro_x_train	7352x128 double
body_gyro_y_train	7352x128 double
body_gyro_z_train	7352x128 double
humanActivityData	7352x19 table
rawSensorDataTrain	7352x6 table
T_mean	7352x6 table
T_pca	7352x6 table

Editor - Untitled4\*

```
function [trainedClassifier, validationAccuracy] = trainClassifier(data)
% Extract predictors and response
predictorNames = {'Wmean_total_acc_x_train', 'Wmean_total_acc_y_train'};
predictors = datasetTable(:, predictorNames);
predictors = table2array(varfun(@double, predictors));
response = datasetTable.activity;
% Train a classifier
trainedClassifier = fitcknn(predictors, response, 'PredictorNames', {'Wmean_total_acc_x_train', 'Wmean_total_acc_y_train'});
% Set up holdout validation
cvp = cvpartition(response, 'Holdout', 0.2);
trainingPredictors = predictors(cvp.training, :);
trainingResponse = response(cvp.training, :);
% Train a classifier
validationModel = fitcknn(trainingPredictors, trainingResponse, 'PredictorNames', {'Wmean_total_acc_x_train', 'Wmean_total_acc_y_train'});
```

Command Window

trainClassifier

22:09 / 34:39





## Example 2: Real-time Car Identification Using Images

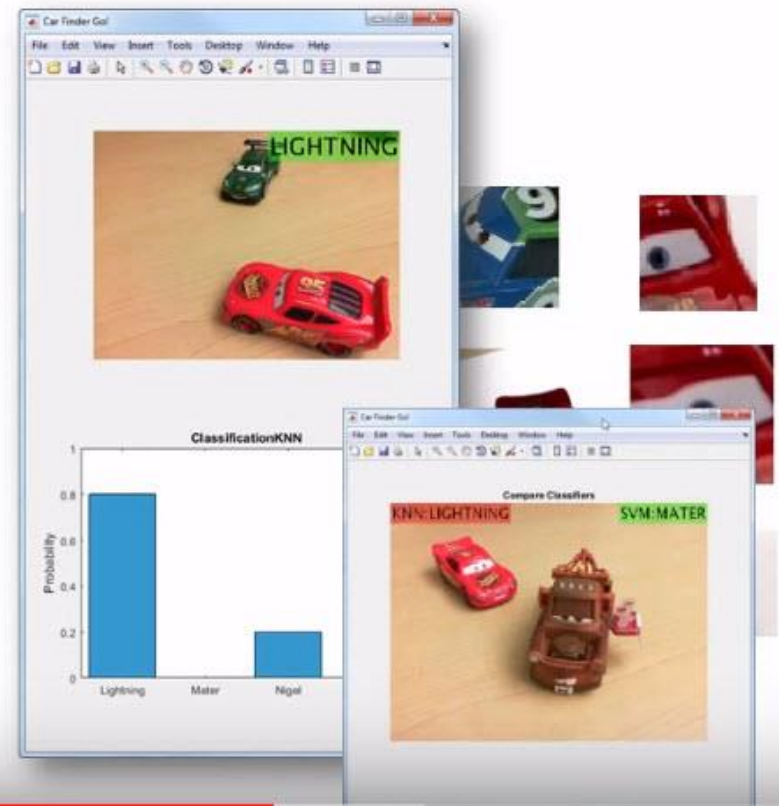
**Objective:** Train a classifier to identify car type from a webcam video

**Data:**

Predictors	Several images of cars: 
Response	NIGEL, LIGHTNING, SANDDUNE, MATER

**Approach:**

- Extract features using Bag-of-words
- Train and compare classifiers
- Classify streaming video from a webcam



The figure displays three overlapping windows from a 'Car Finder GUI' application. The top window shows a webcam feed of a green toy car labeled 'LIGHTNING' in green text. The bottom-left window shows a bar chart titled 'ClassificationKNN' with a y-axis labeled 'Probability' ranging from 0 to 1. The x-axis lists 'Lightning', 'Mater', and 'Nigel'. The bars show a probability of approximately 0.8 for 'Lightning', 0 for 'Mater', and approximately 0.2 for 'Nigel'. The bottom-right window shows a 'Compare Classifiers' window with an image of a red toy car and a brown toy car. The red car is labeled 'KNN: LIGHTNING' and the brown car is labeled 'SVM: MATER'.






MATLAB R2015a

image9.png - Windows Photo Viewer

File Print E-mail Burn Open



Command History

25:39 / 34:39

CC Settings Window Share Full Screen

The image shows a screenshot of a MATLAB R2015a environment. A Windows Photo Viewer window is open, displaying a photograph of a red and grey toy car with a screen on top. The car is positioned on a light-colored surface. The Photo Viewer interface includes a menu bar with options like File, Print, E-mail, Burn, and Open. Below the image is a control bar with various icons for zooming, rotating, and navigating. At the bottom of the screen, a video player interface is visible, showing a progress bar at 25:39 / 34:39 and standard playback controls. A mouse cursor is pointing at the play button in the Photo Viewer's control bar.



MATLAB R2015a

HOME PLOTS APPS SHORTCUTS EDITOR PUBLISH VIEW

File Edit Breakpoints Run Run and Advance Run Section Advance Run and Time

W:\Examples\CarFinder

Current Folder

- Lightning
- Function
  - trainClassifier.m
  - getImageLabels.m
  - CarFinderLiveCompare.m
  - CarFinderLive.m
- Script
  - CarIdentification.m

CarIdentification.m (Script)

Workspace

Name	Value
------	-------

Editor - W:\Examples\CarFinder\CarIdentification.m

```
1 %% Real-time Car Identification Using Image Data
2 % Image classification involves determining if an image contains some
3 % specific object, feature, or activity. The goal of this example is to
4 % provide a strategy to construct a classifier that can automatically
5 % detect which car we are looking at using streaming images from a web
6 % feed.
7 % Copyright (c) 2015, MathWorks, Inc.
8
9 %% Load image data
10 imset = imageSet('CarData', 'recursive');
11
12 %% Pre-process Training Data: *Feature Extraction*
13 % Requires: Computer Vision System Toolbox
14
15 % Create a bag-of-features from the Car image database
16 bag = bagOfFeatures(imset, 'VocabularySize', 200, ...
17 'PointSelection', 'Detector');
```

Command Window

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script



MATLAB R2015a

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- Function
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  - getImageLabels.m
  - CarFinderLiveCompare.m
  - CarFinderLive.m
- Script
  - CarIdentification.m

CarIdentification.m (Script)

Workspace

Name	Value
imset	1x4 imageSet

```
11
12 %% Pre-process Training Data: *Feature Extraction*
13 % Requires: Computer Vision System Toolbox
14
15 % Create a bag-of-features from the Car image database
16 bag = bagOfFeatures(imset, 'VocabularySize', 200, ...
17     'PointSelection', 'Detector');
18
19 % Encode the images as new features
20 imagefeatures = encode(bag, imset);
21
22 %% Create a Table using the encoded features
23 CarData = array2table(imagefeatures);
24 CarData.carType = getImageLabels(imset);
25
26 %% Use the new features to train a model and assess its performance
27 classificationLearner
```

Command Window

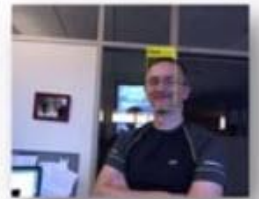
26:34 / 34:39

script

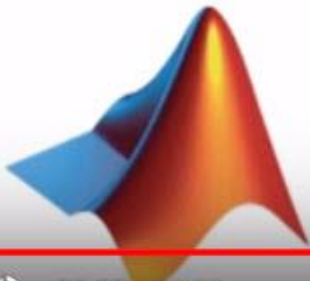


## Key Takeaways

- Consider Machine Learning when:
  - Hand written rules and equations are too complex
    - *Face recognition, speech recognition, recognizing patterns*
  - Rules of a task are constantly changing
    - *Fraud detection from transactions, anomaly in sensor data*
  - Nature of the data changes and the program needs to adapt
    - *Automated trading, energy demand forecasting, predicting shopping trends*



- MATLAB for Machine Learning



Email me if you have further questions

