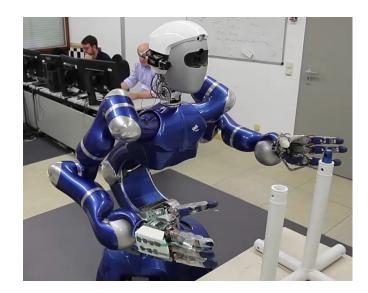
MATLAB EXPO 2018

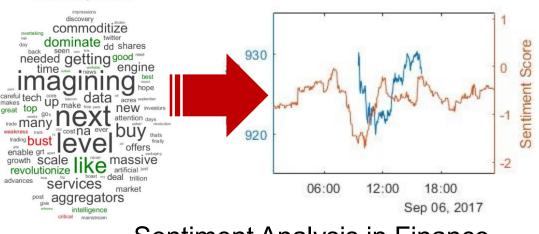
Unlocking the Power of Machine Learning

Antti Löytynoja

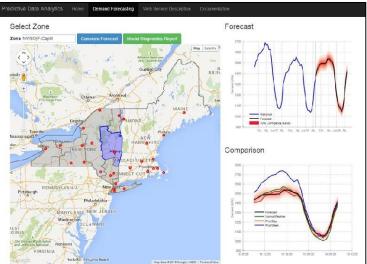
Machine Learning has driven Innovation

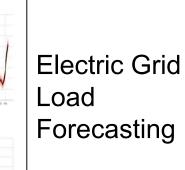


Robots mimic complex human behaviors



Sentiment Analysis in Finance







Restore Arm Control for Quadriplegic



Outline

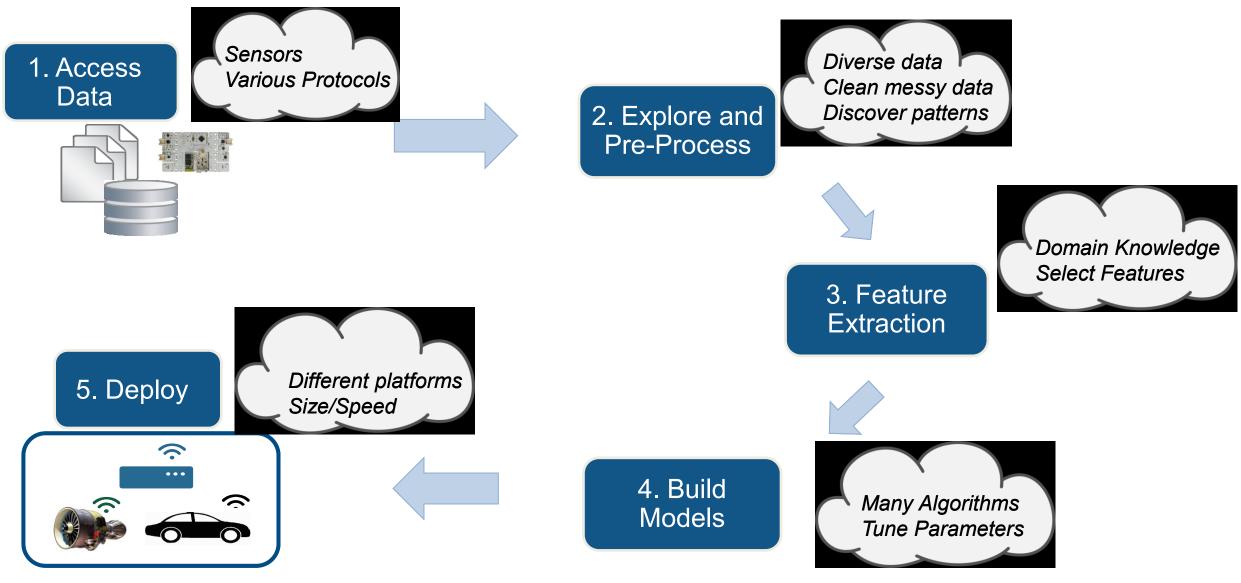
- Machine Learning workflow and its challenges
- Overview of Types of Machine Learning
- Developing a Heart Sound Classifier

Key takeaways

- Cover complete workflow (exploration to deployment)
- Make data exploration easy
- Make machine learning easy



Challenges in Developing Machine Learning Applications



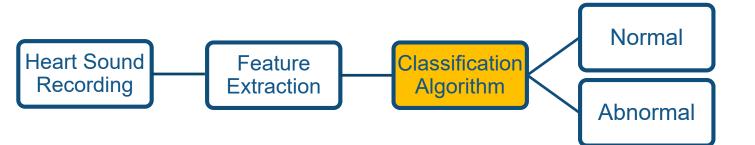
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Case Study: Heart Sound Classifier

Motivation

- Heart sounds require trained clinicians for diagnosis
- Lowered FDA requirements renewed interest
- Digital Health applications

Goal: build a classifier and deploy in portable device



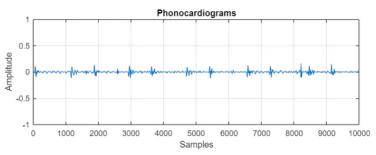
Data: Heart sound recordings (phonocardiogram):

- From <u>PhysioNet Challenge 2016</u>
- 5 to 120 seconds long audio recordings

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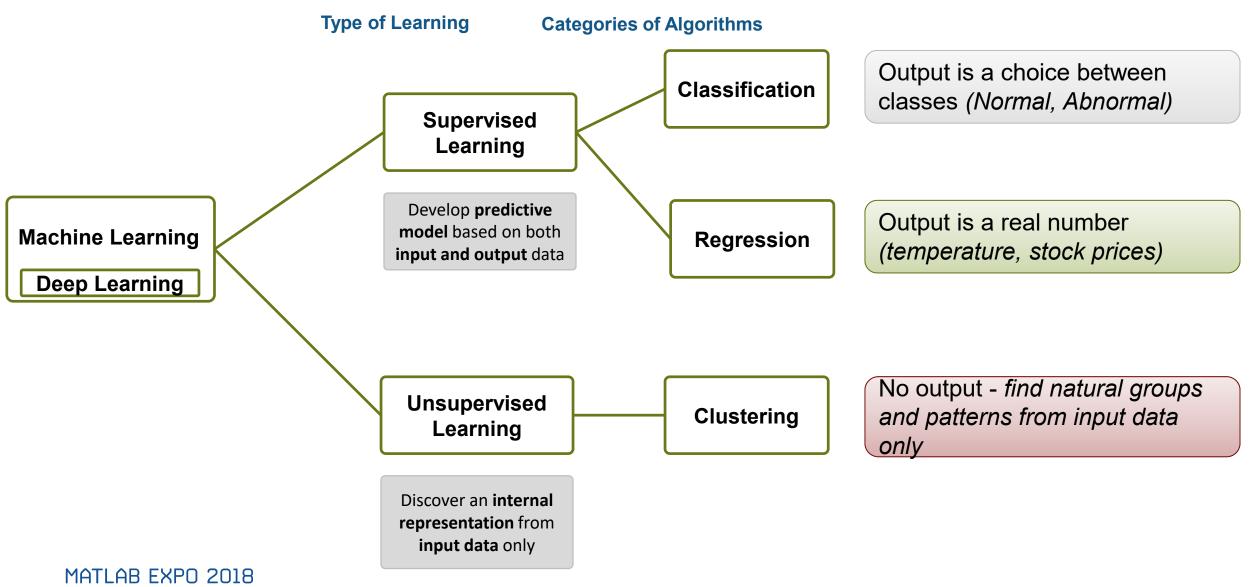
Heart Sound Classification Ground Truth Normal Predicted Normal

Unlocking Power of Machine Learning



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Different Types of Learning





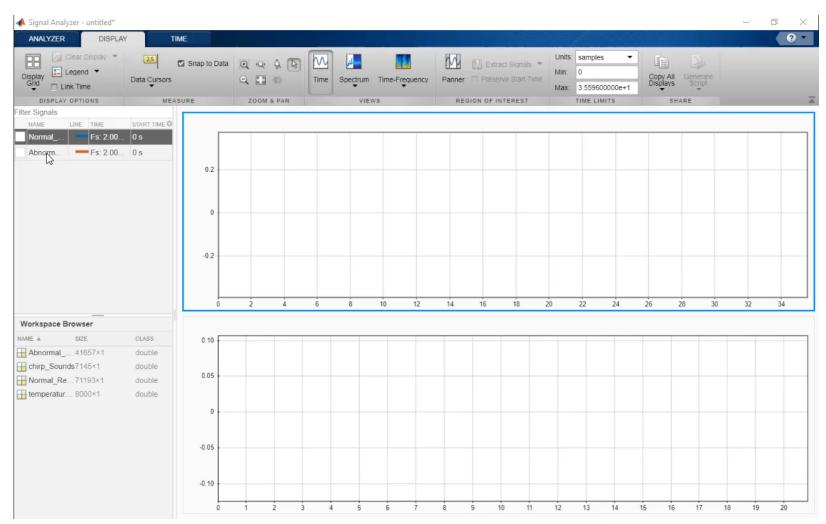
Step 1: Access & Explore Data

Challenges:

- Different sampling rates
- Signal Management
- Large datasets ("big data")

Easy Exploration of Data

- Time domain
- Frequency domain
- Time-Frequency domain



Signal Analyzer: Visual Data Exploration





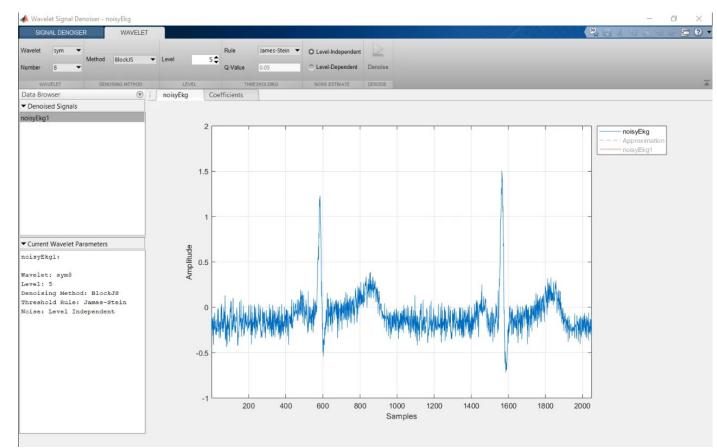
Step 2: Pre-process Signals

Challenges

- Preserving sharp features
- Overlap of signal and noise spectra

Automatic Denoising

Generate MATLAB code



Signal Pre-processing without writing any code



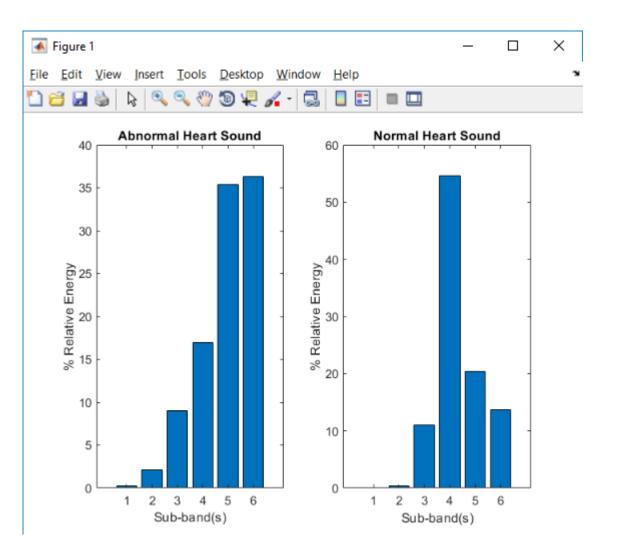
Step 3: Extract Features

Challenges

- Find features for non-stationary signals
- Features occurring at different scales
- Feature selection

Spectral features:

- Mel-Frequency Cepstral Coefficients
- Octave band decomposition with Wavelets





Step 4: Train Models

Challenges:

- Knowledge of machine learning algorithms
- Scale to large data sets

Quickly train model in App

- Define cross-validation
- Try all popular algorithms
- Analyze performance: 93% on test data

Scale to large data sets without recoding: "Tall" arrays

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New Feature PCA Fine KNN ession ▼ Selection	Medium KNN Coarse	KNN C	cosine KNN	Advanced	Use Parallel		catter Plot	Confusion Matrix	ROC Curve	Parallel Coordinates Plot	Export Model 1
FILE FEATURES	MODEL				TRAININ	NG			PLOTS		EXPORT
ata Browser		•	Scatter Plo	t 🛛 Con	fusion Mat	rix X	ROC Cu	Jrve 🛛			
History											
1.1 🏠 Tree Last change: Fine Tree	Accuracy: 85.2% 71/71 features	^							Pred	ictions: mode	1.4
1.2 🏠 Tree Last change: Medium Tree	Accuracy: 84.9% 71/71 features			0.2							
1.3 🏠 Tree Last change: Coarse Tree	Accuracy: 83.0% 71/71 features										
1.4 🏠 KNN Last change: Fine KNN	Accuracy: 88.7% 71/71 features	_		0.1							
1.5 🏠 KNN Last change: Medium KNN	Accuracy: 87.6% 71/71 features			0							•
1.6 ☆ KNN Last change: Coarse KNN	Accuracy: 85.3% 71/71 features		Value	-0.1							and the
1.7 🏠 KNN Last change: Cosine KNN	Accuracy: 87.4% 71/71 features		medianValue	-0.1						فيحجره والمع	•
1.8 🏠 KNN Last change: Cubic KNN	Canceled 71/71 features		E	-0.2							
1.9 ☆ KNN	Canceled	~						¥	•• ×		
Current Model				-0.3							
Model 1.4: Trained		^				. •	•				
Results Accuracy 88.7%				-0.4	•	•					
Prediction speed ~530 obs/sec Training time 13.98 sec				-0.5	•						
Madal Tura				-0.5		-0.4		-0.3	-0.	.2 -0 meanValue).1
Model Type Preset: Fine KNN		~									

Model Training with Classification Learner



Step 4 Cont'd: Optimize Model

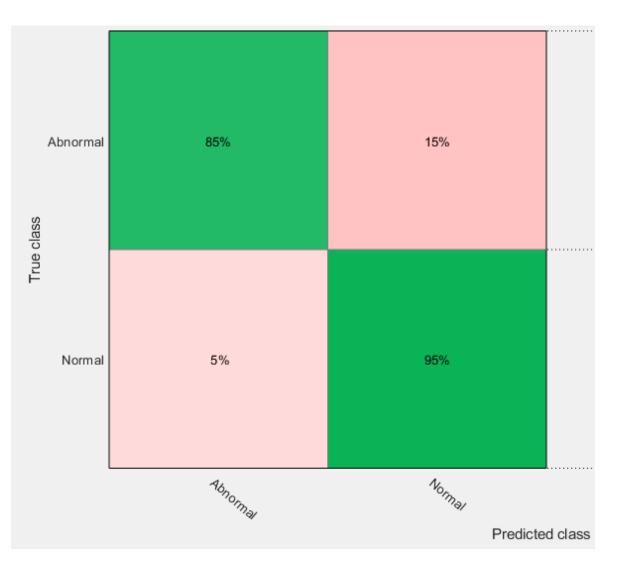
Challenges:

- Manual parameter tuning tedious
- Identify additional improvements

Iterative Model Optimization

- Bayesian Optimization of parameters
- Visually analyze performance
- Adjust for imbalances (data or severity of misclassifications)

Class	Distribution				
Normal	75%				
Abnormal	25%				





Step 5: Deploy

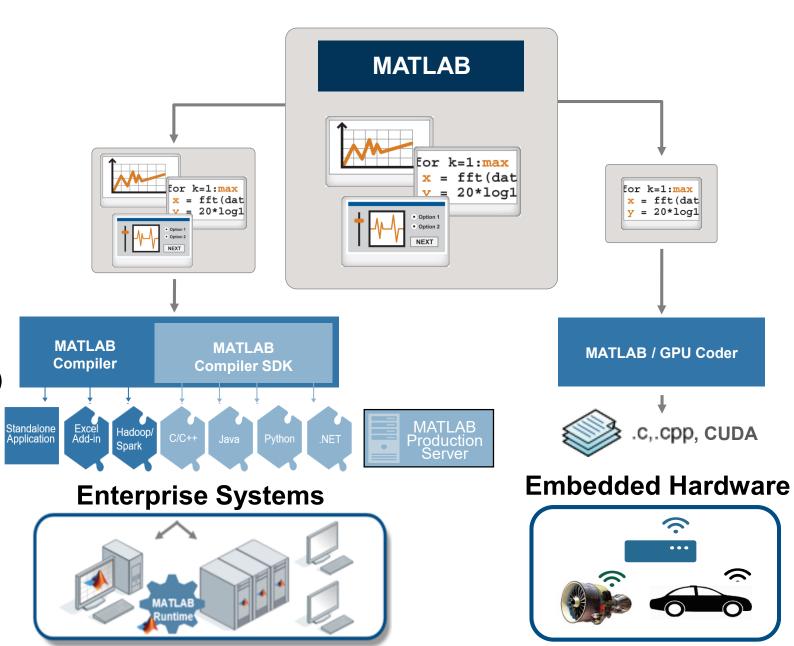
Challenges:

- Different target platforms
- Hardware requirements
 (Size, Speed, Fixed point, etc)

Deployment options:

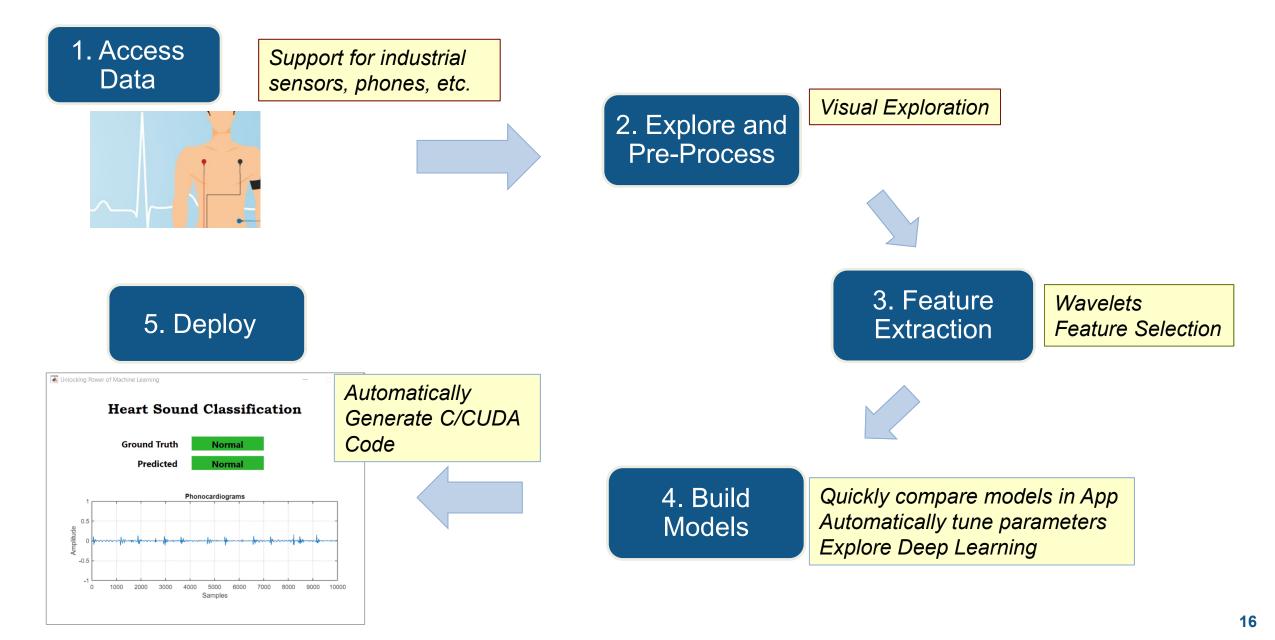
- Generate Code (C, HDL, PLC) for Embedded System
- Compile MATLAB, scale using MPS for Enterprise systems

Apply automated feature selection to reduce model size MATLAB EXPO 2018





Summary: Making Machine Learning Easier





Key takeaways

Empower engineers to be productive in data science!

- Cover complete workflow (exploration to deple
- Make machine learning easy
- Support for Deep Learning





Learn More

Complete user story for **Battelle's "NeuroLife"** system

Download <u>Heart Sounds Classification</u> application from File Exchange

Watch <u>"Machine Learning Using Heart Sound Classification</u>"

Read:

- Machine Learning with MATLAB
- What is Deep Learning?