



**WIR BEGEISTERN UNSERE KUNDEN MIT  
EMOTIONALEN FAHRERLEBNISSEN.**

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# MACHINE LEARNING AS A EXAMPLE FOR OVERRIDE DETECTION

**SUPERVISED MACHINE LEARNING WITH MATLAB.**

**BMW  
GROUP**



**Rolls-Royce**  
Motor Cars Limited

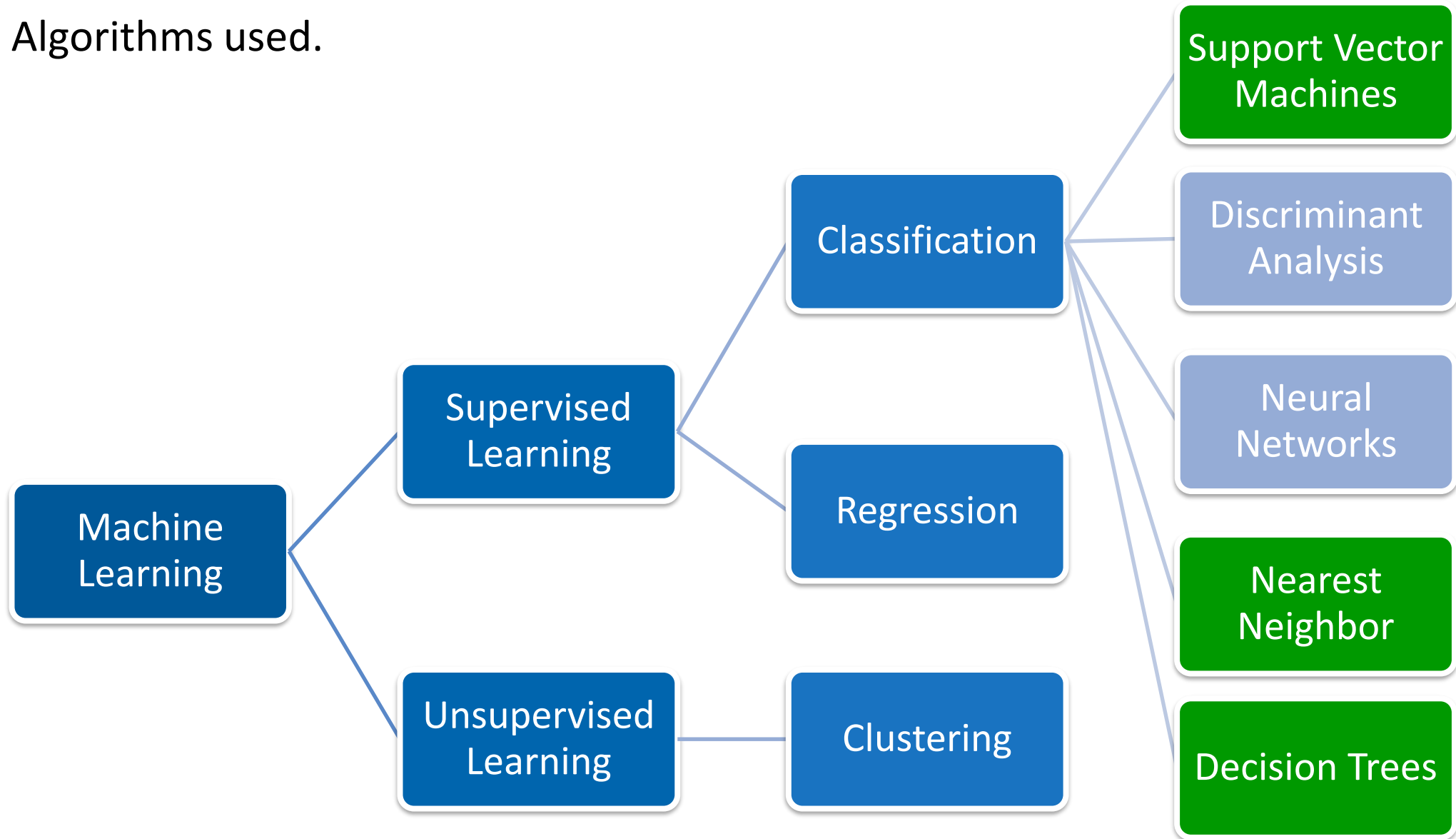
## MOTIVATION.

Evaluation of the "Statistics and Machine Learning" Toolbox from MATLAB

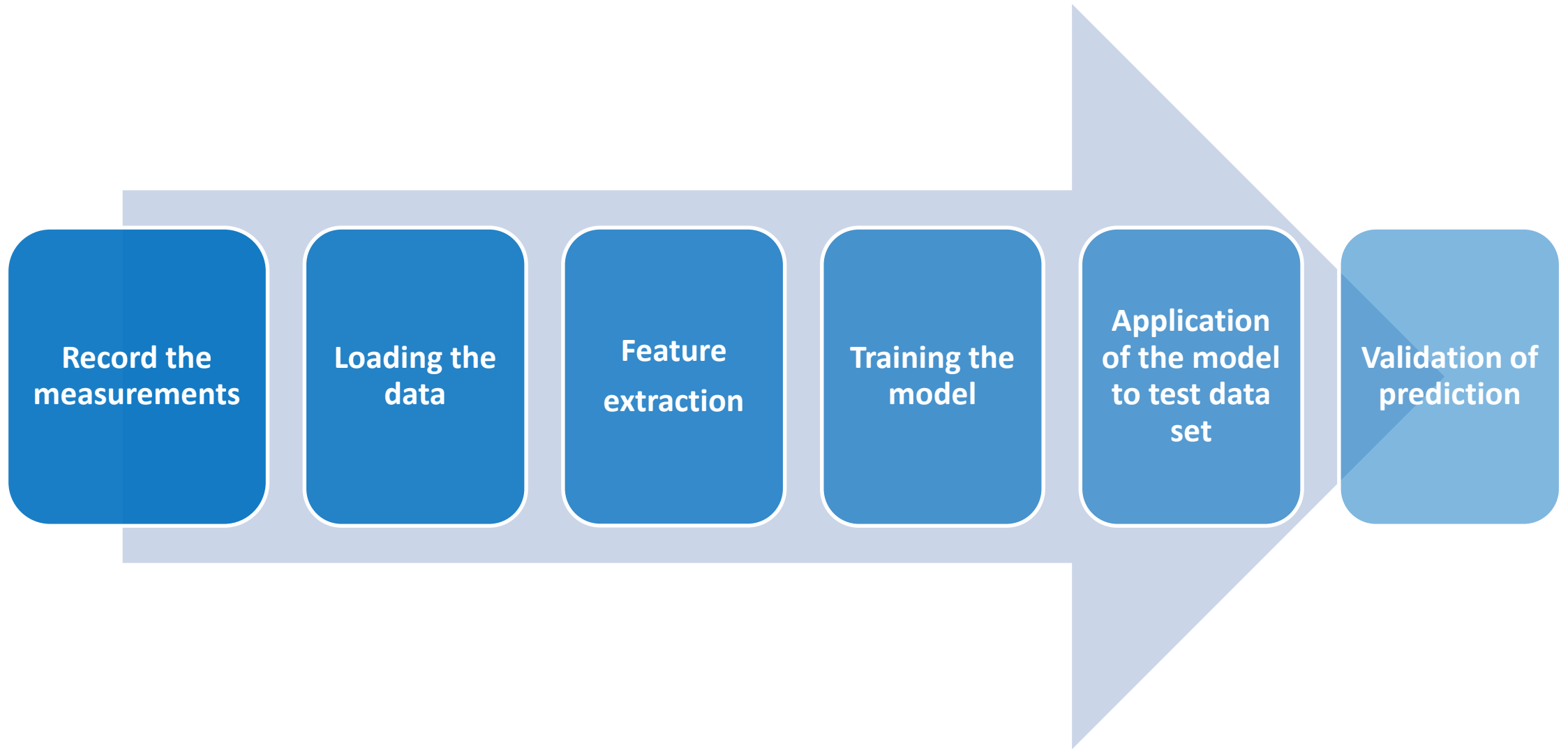
Large number of recorded vehicle measurements (unlabeled) available

# MACHINE LEARNING.

Algorithms used.

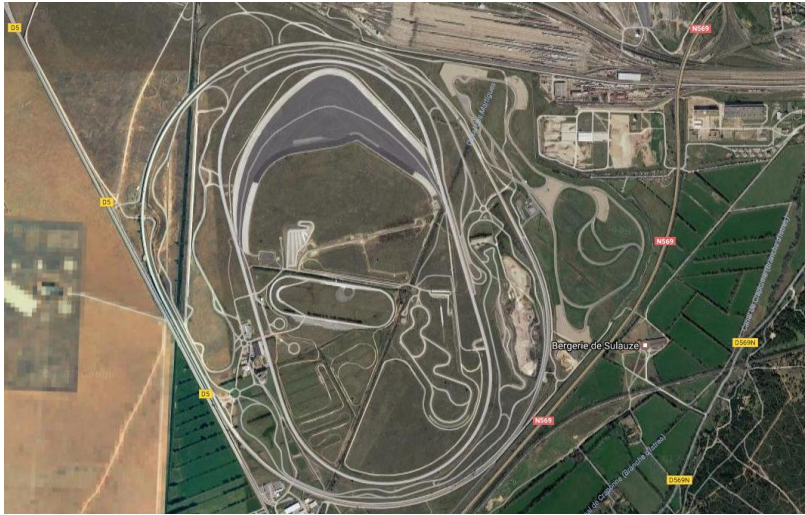


# WORKFLOW.



# GENERATION OF THE MEASURED DATA. TRACK

Train a model



Training data set:

- Handling course Miramas
- 259.000 data points
- $\cong$  43 minutes

Test the trained model

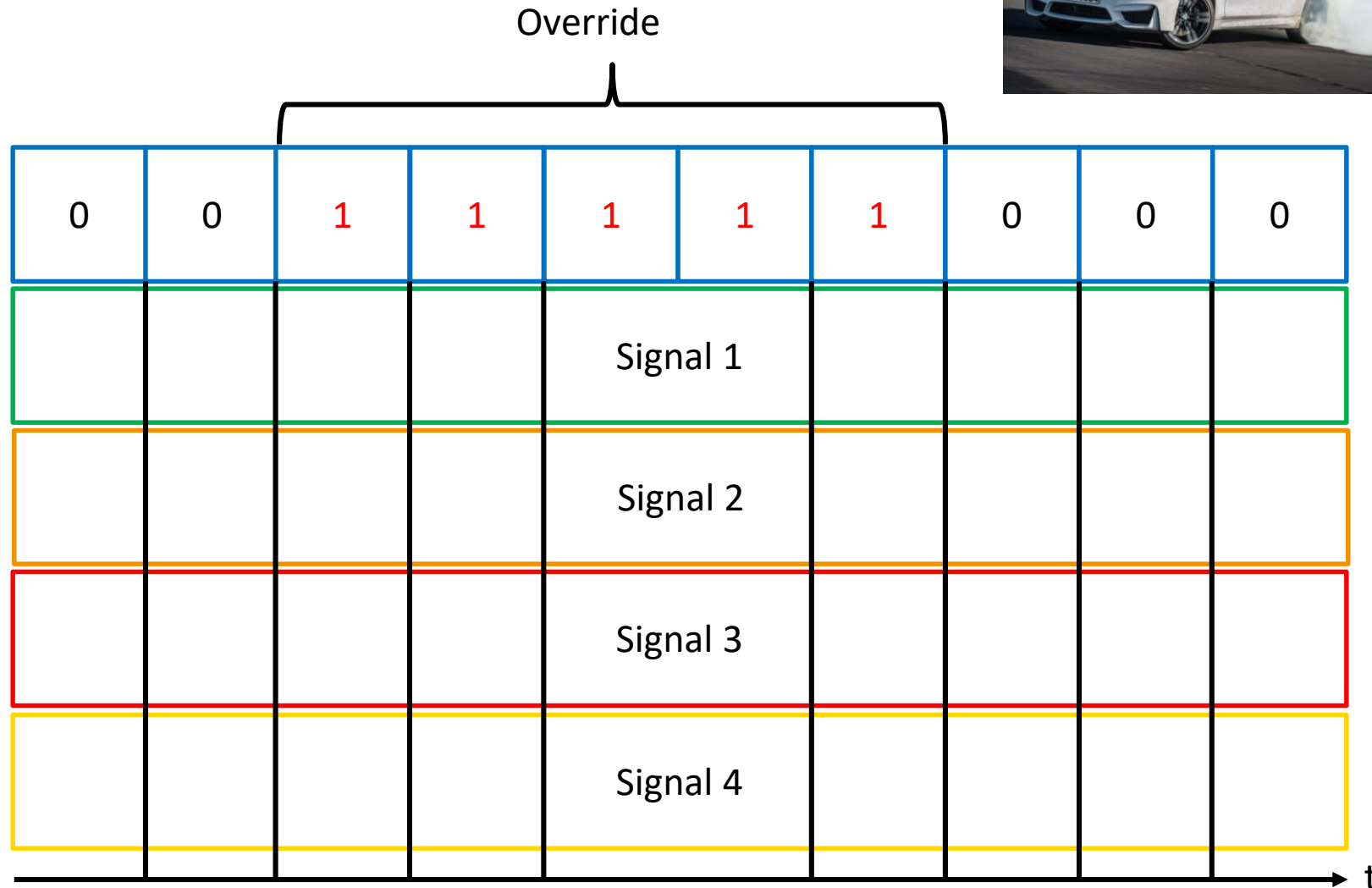


Test data set:

- Handling course Aschheim
- 150.000 data points
- $\cong$  25 minutes

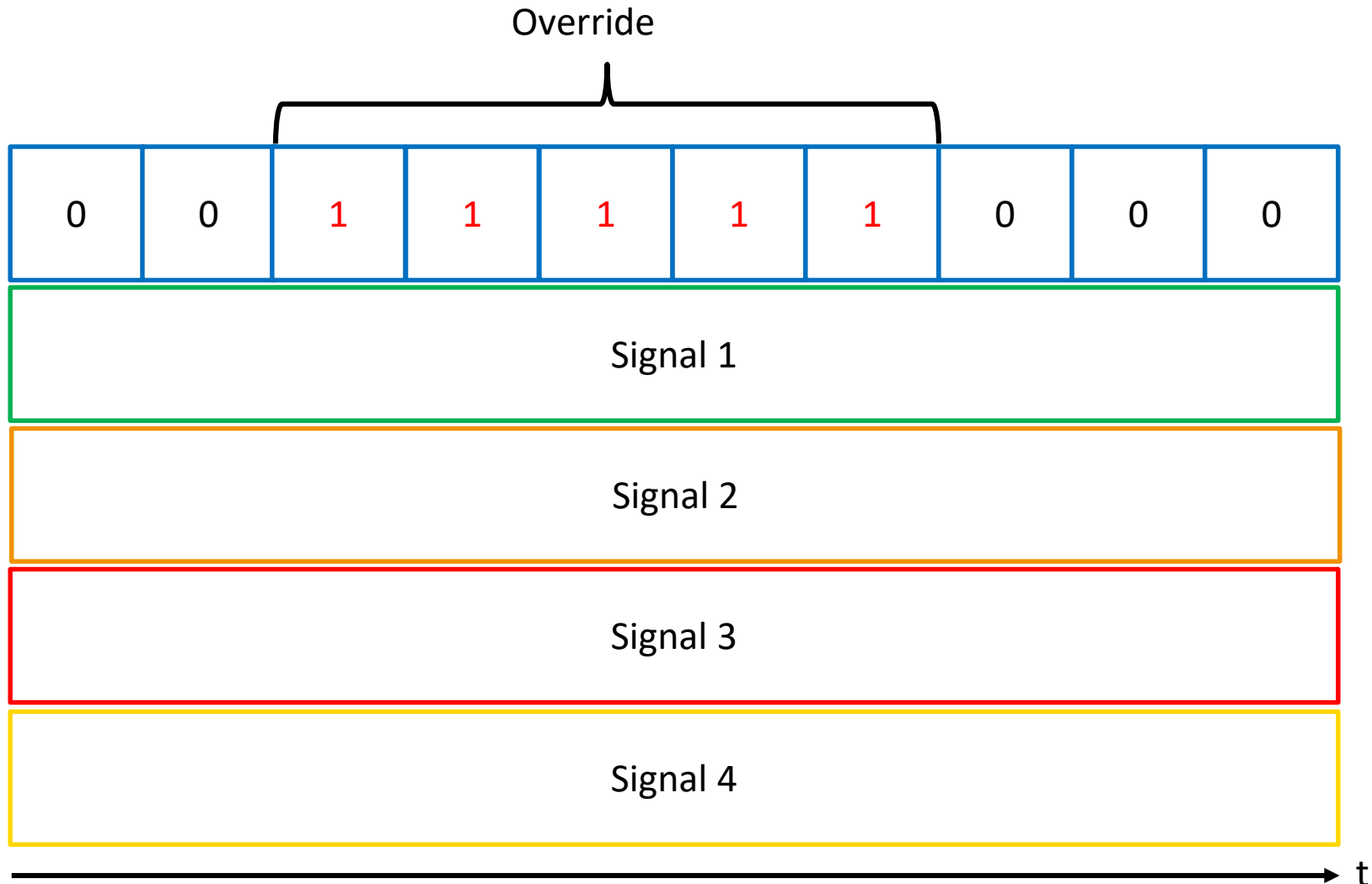
# GENERATION OF THE MEASURED DATA.

Insert a trigger signal.



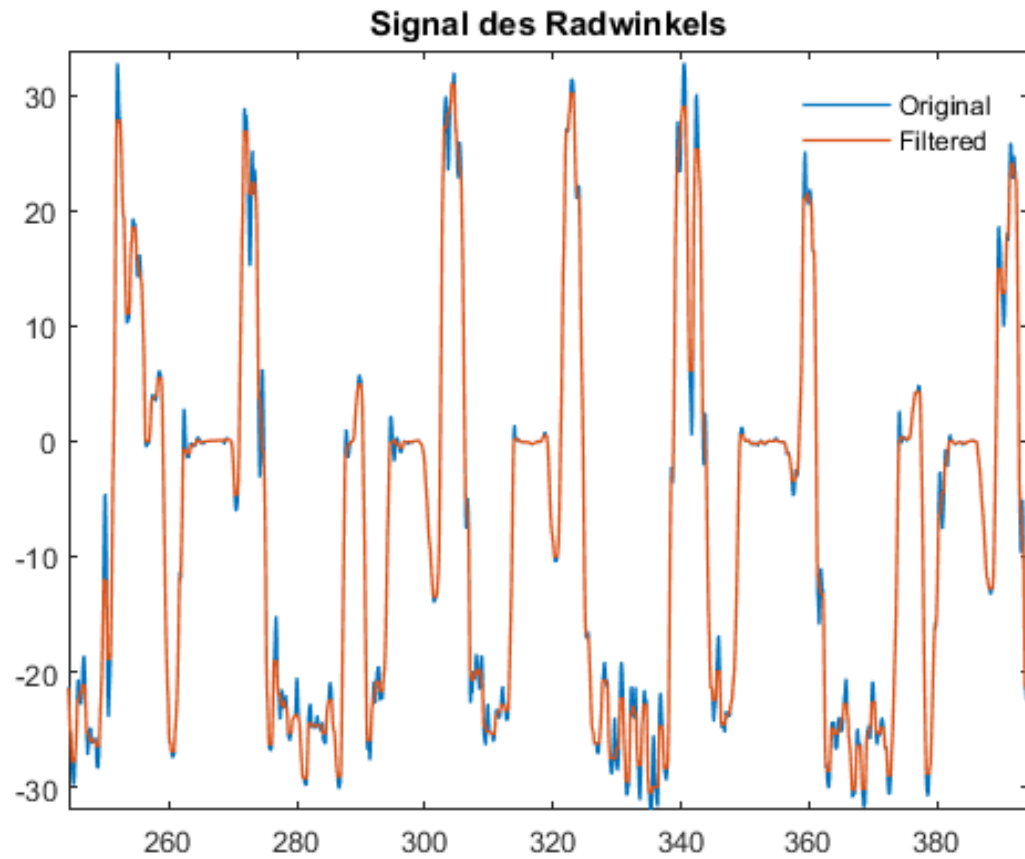
# GENERATION OF THE MEASURED DATA.

Insert a trigger signal.



# FEATURE EXTRACTION.

Filter.



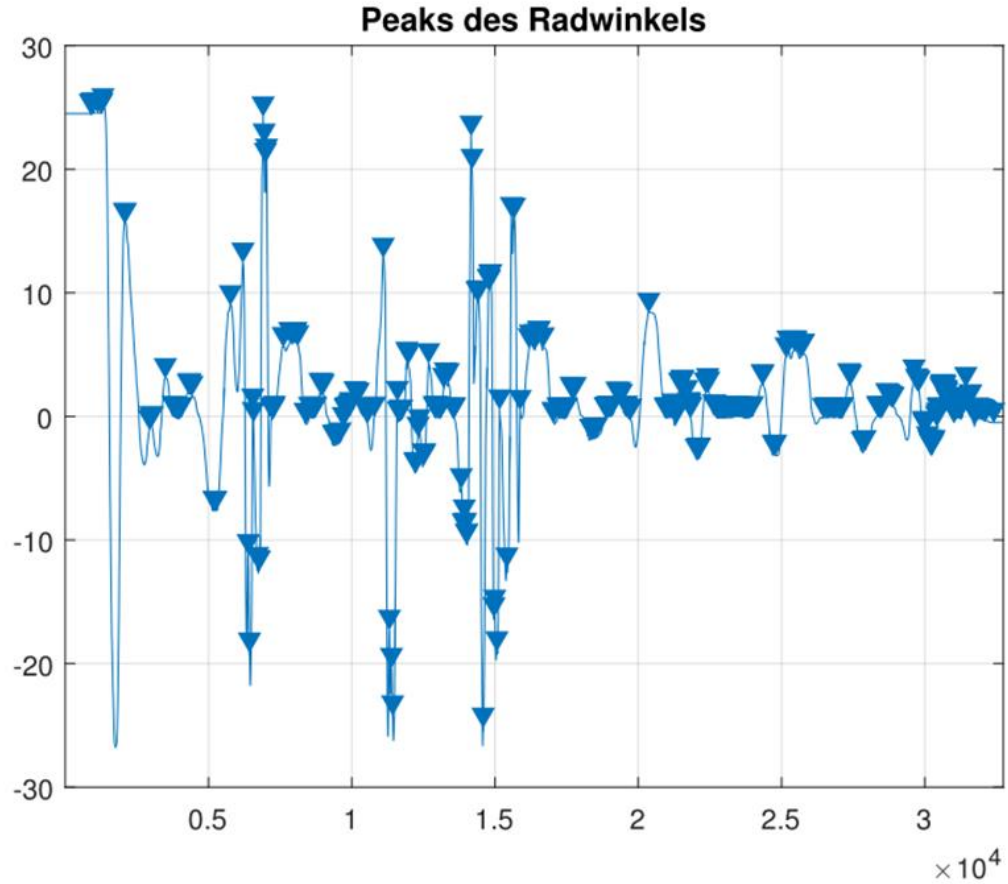
Suppress signal noise

Training and test data sets have to filter in the same way



# FEATURE EXTRACTION.

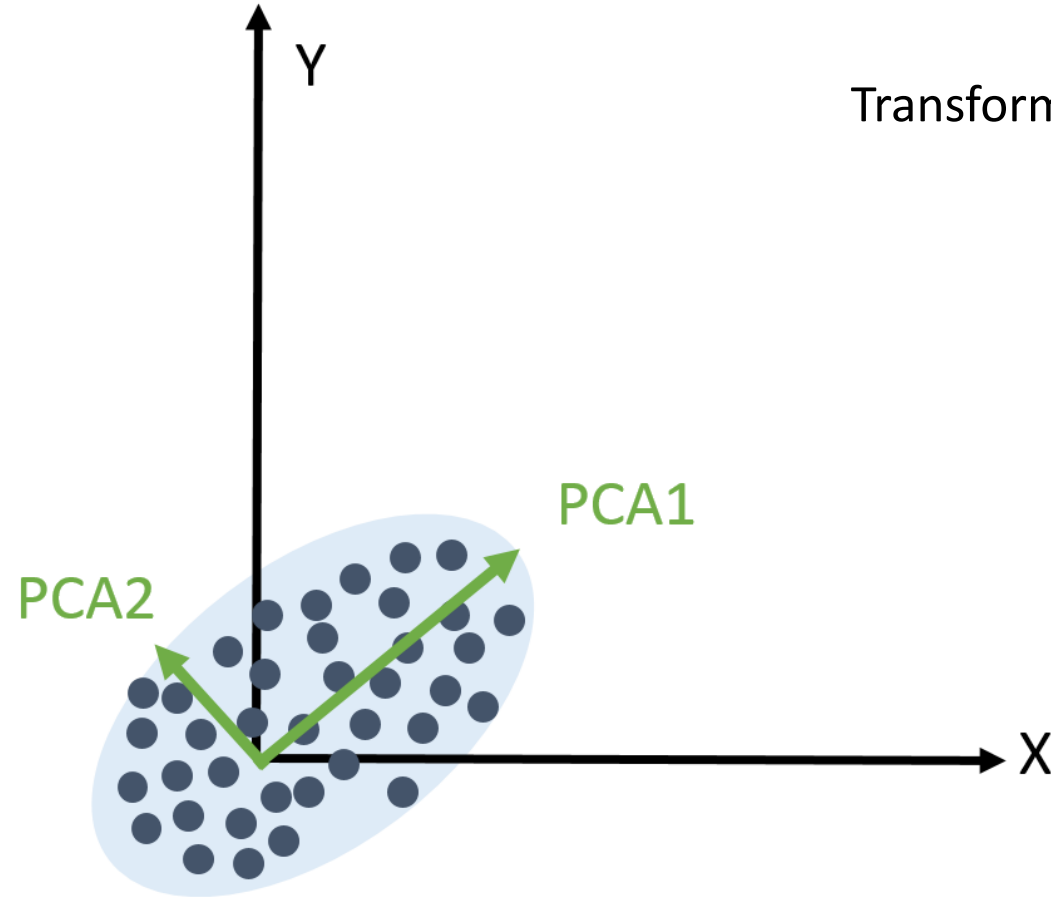
## Peak Analysis.



- Use the FindPeaks function
- Minimum distance between the peaks

# FEATURE EXTRACTION.

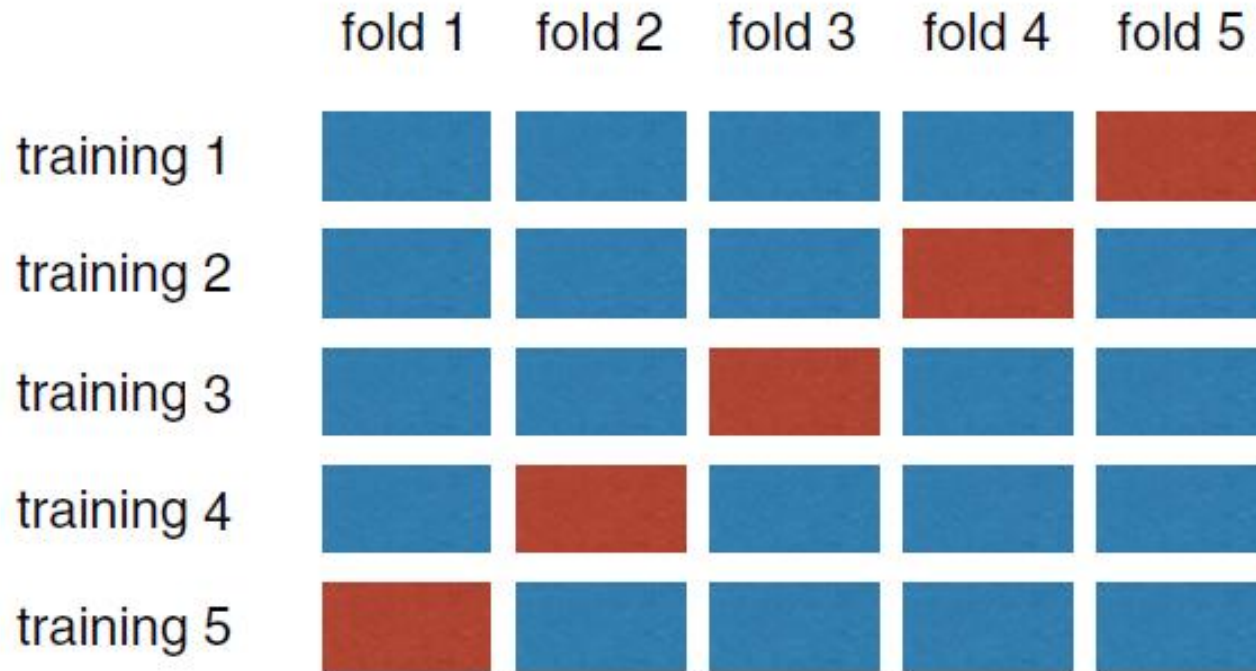
Principal Component Analysis (PCA).



Transformation in the directions of Principal Components

# MODEL SELECTION.

## K-Fold Crossvalidation.



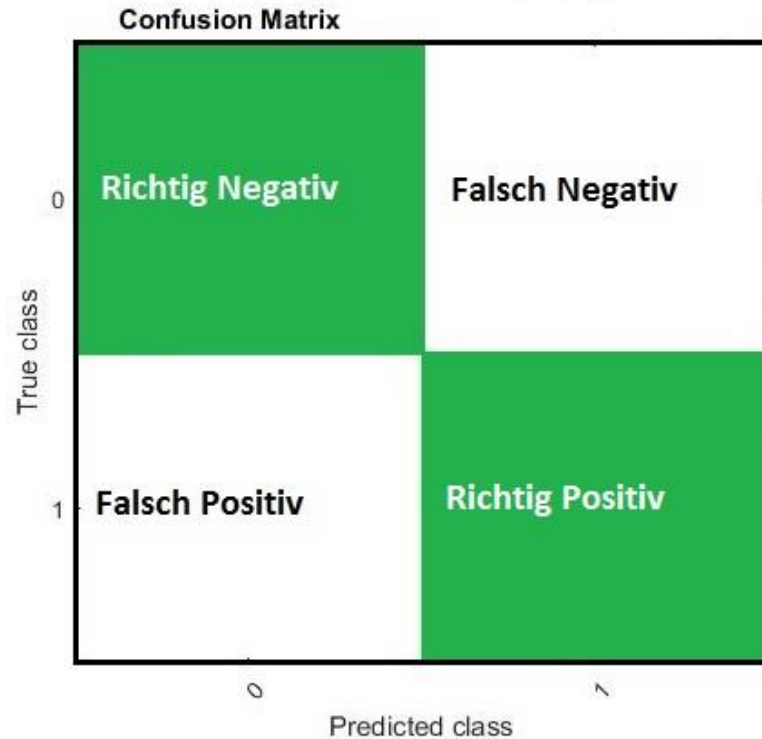
Blue= Training data set  
Red= Test data set

Results: Average error

Source: Machine Learning for Evolution Strategies, Kramer, 2016, S.39

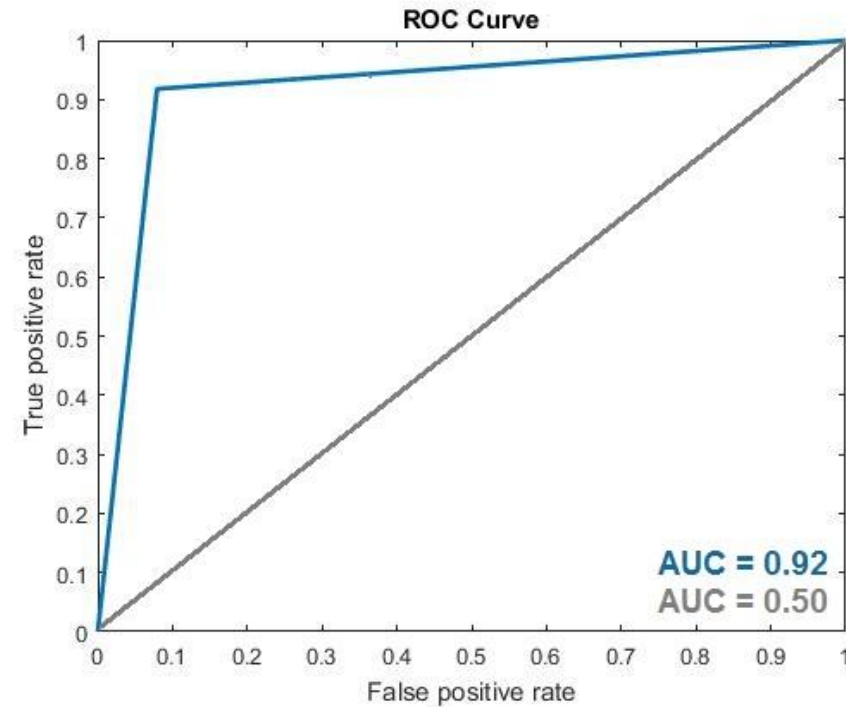
# MODEL SELECTION.

confusion matrix.



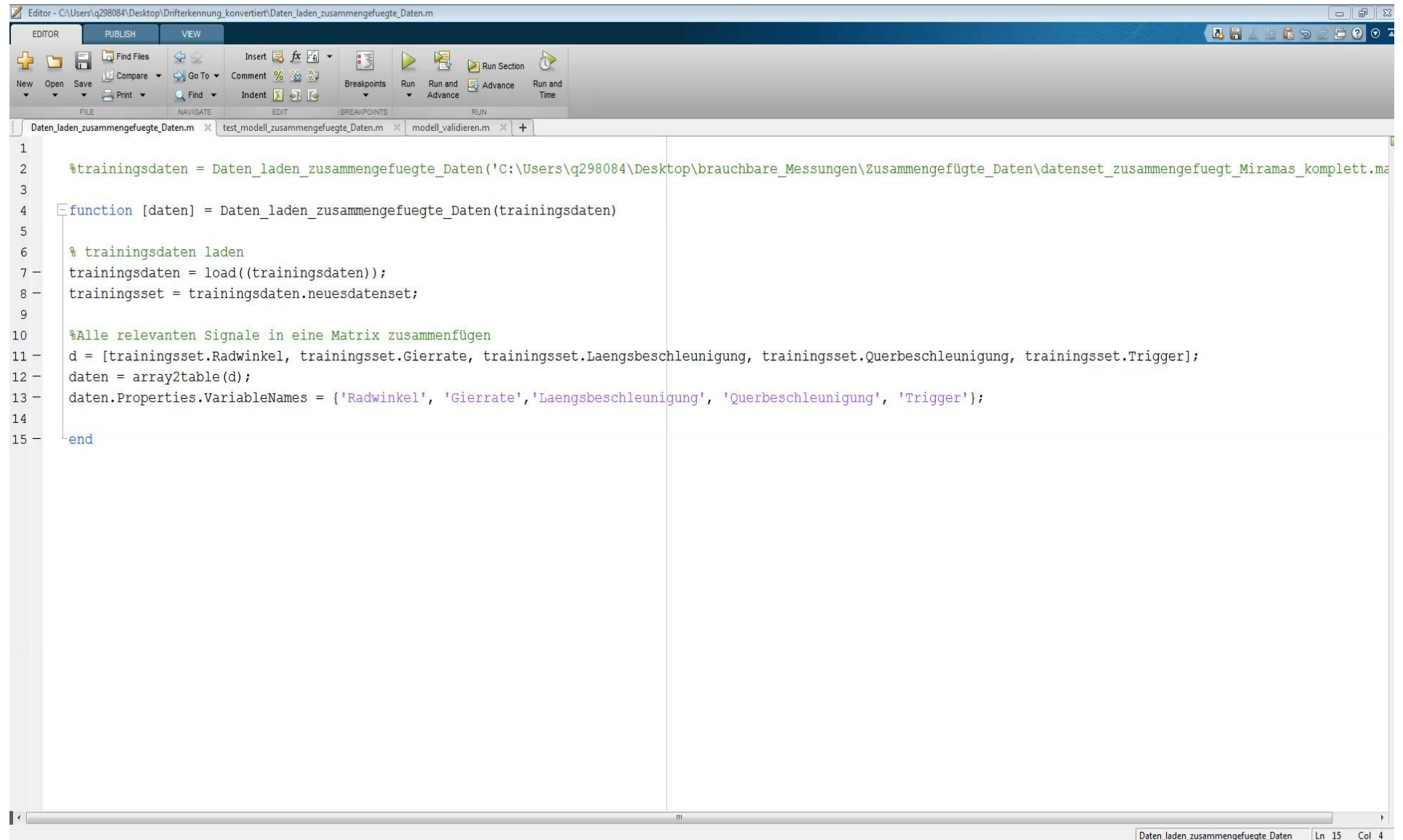
Goal:  
100 % on the green diagonal

Receiver-Operating-Characteristic-Curve.



Goal :  
AUC = 1

# VIDEO: PROCEDURE.



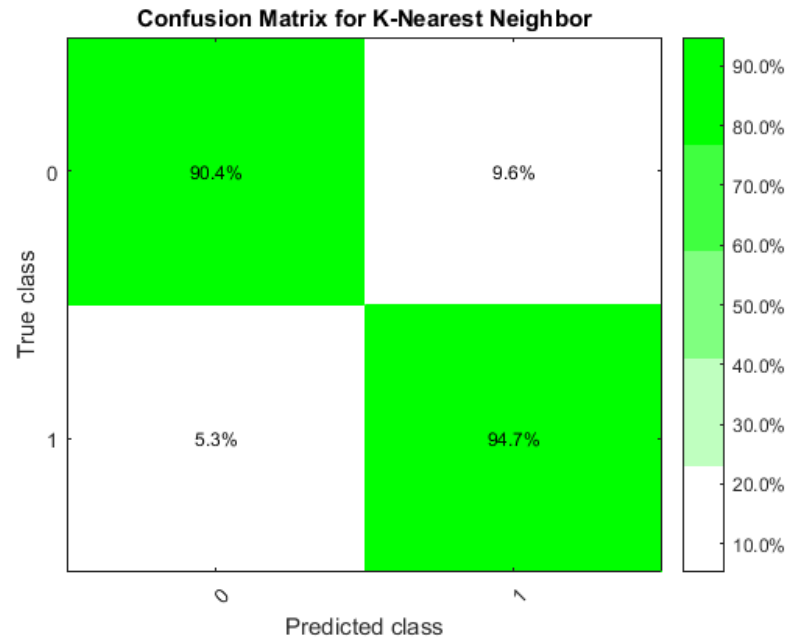
The image shows a MATLAB editor window with the following code:

```
1 %trainingsdaten = Daten_laden_zusammengefuegte_Daten('C:\Users\q298084\Desktop\brauchbare_Messungen\Zusammengefuegte_Daten\datenset_zusammengefuegt_Miramas_komplett.ma
2
3
4 function [daten] = Daten_laden_zusammengefuegte_Daten(trainingsdaten)
5
6 % trainingsdaten laden
7 trainingsdaten = load(trainingsdaten);
8 trainingsset = trainingsdaten.neuesdatenset;
9
10 %Alle relevanten Signale in eine Matrix zusammenfügen
11 d = [trainingsset.Radwinkel, trainingsset.Gierrate, trainingsset.Laengsbeschleunigung, trainingsset.Querbeschleunigung, trainingsset.Trigger];
12 daten = array2table(d);
13 daten.Properties.VariableNames = {'Radwinkel', 'Gierrate', 'Laengsbeschleunigung', 'Querbeschleunigung', 'Trigger'};
14
15 end
```

The status bar at the bottom right indicates the current position: Daten\_laden\_zusammengefuegte\_Daten | Ln 15 | Col 4

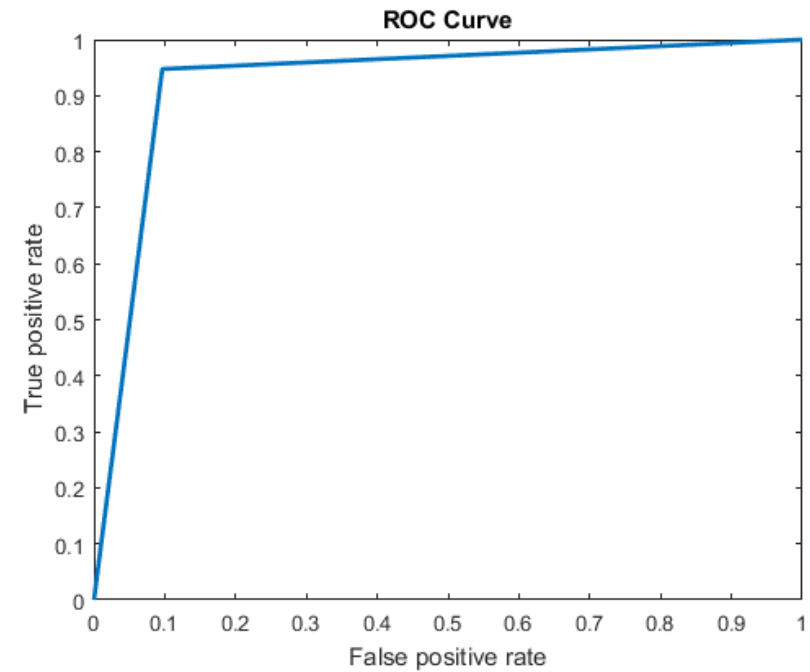
# RESULTS.

## confusion matrix: K-Nearest Neighbor & PCA Feature Extraktion



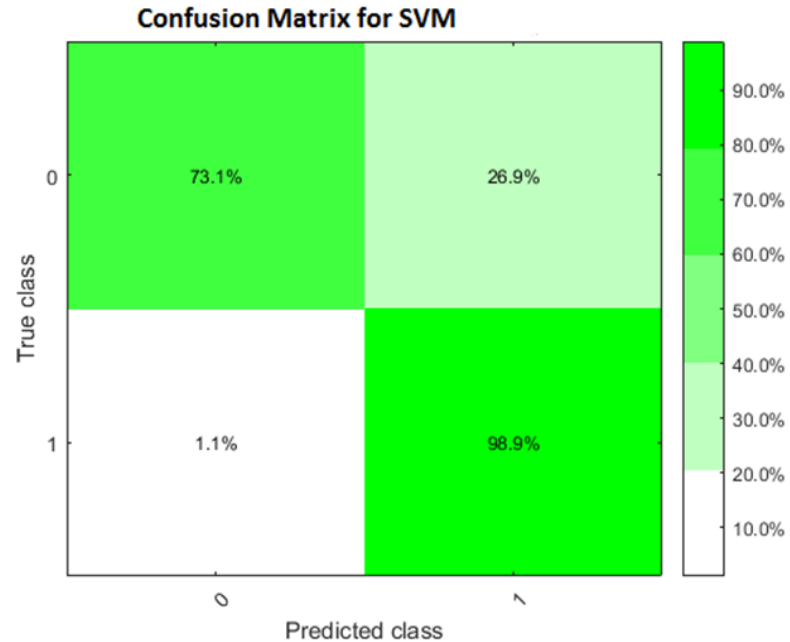
Performance of model :

	Predicted 0	Predicted 1
Actual 0	90.35% (82943)	9.65% (8856)
Actual 1	5.26% (3162)	94.74% (57004)



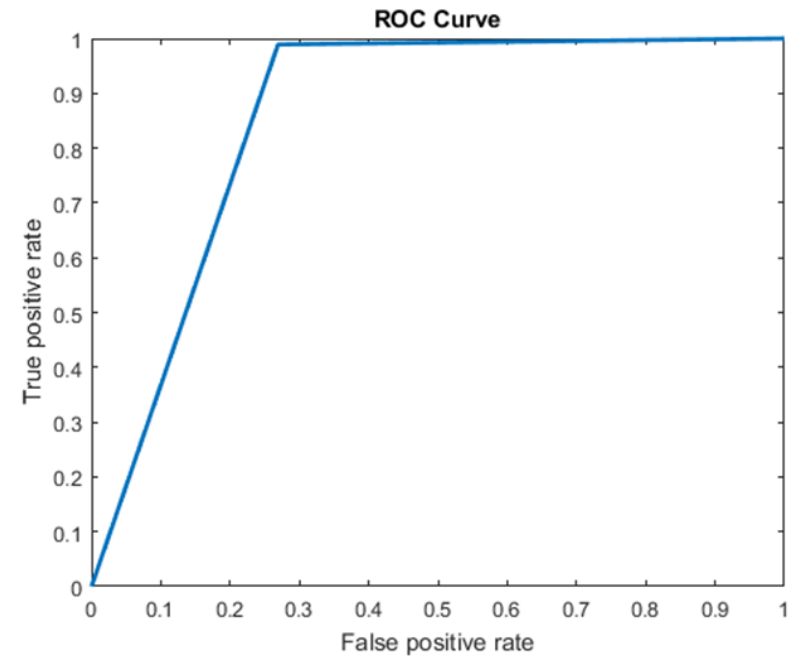
# RESULTS.

## confusion matrix: Support Vector Machine



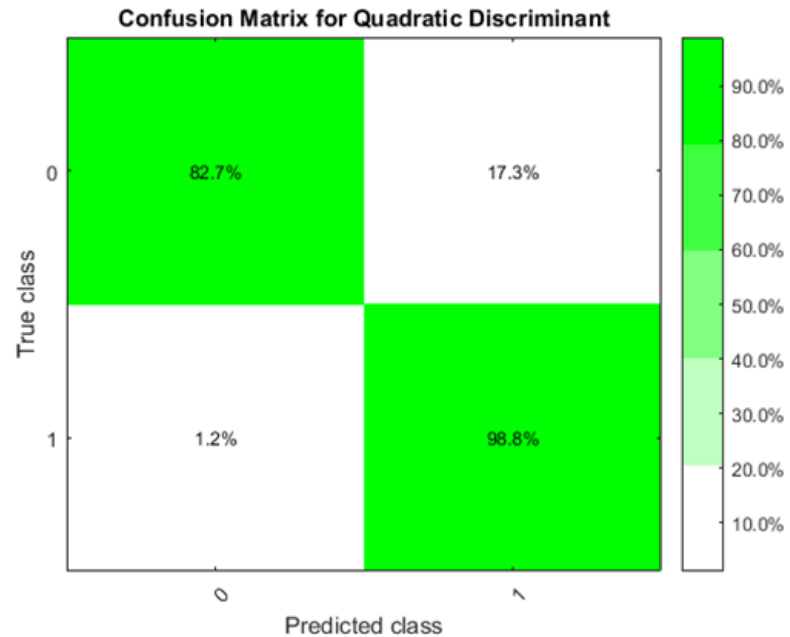
Performance of model :

	Predicted 0	Predicted 1
Actual 0	73.07% (67078)	26.93% (24721)
Actual 1	1.08% (650)	98.92% (59516)



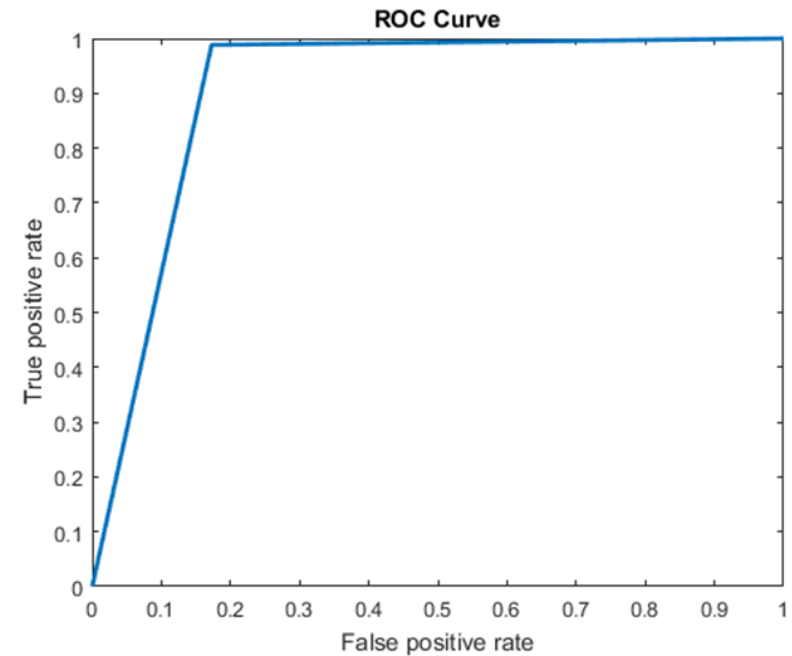
# RESULTS.

confusion matrix: Quadratic Discriminant analysis model



Performance of model :

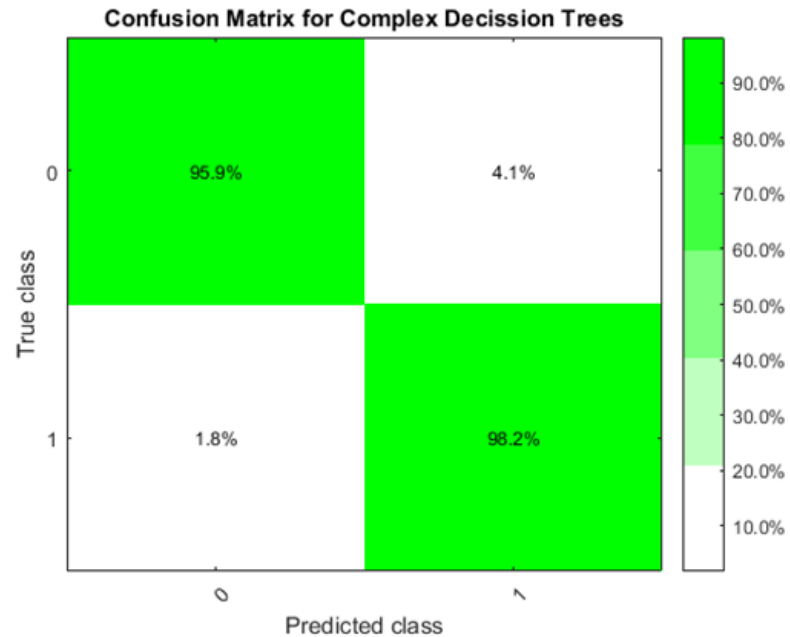
	Predicted 0	Predicted 1
Actual 0	82.73% (75946)	17.27% (15853)
Actual 1	1.17% (701)	98.83% (59465)





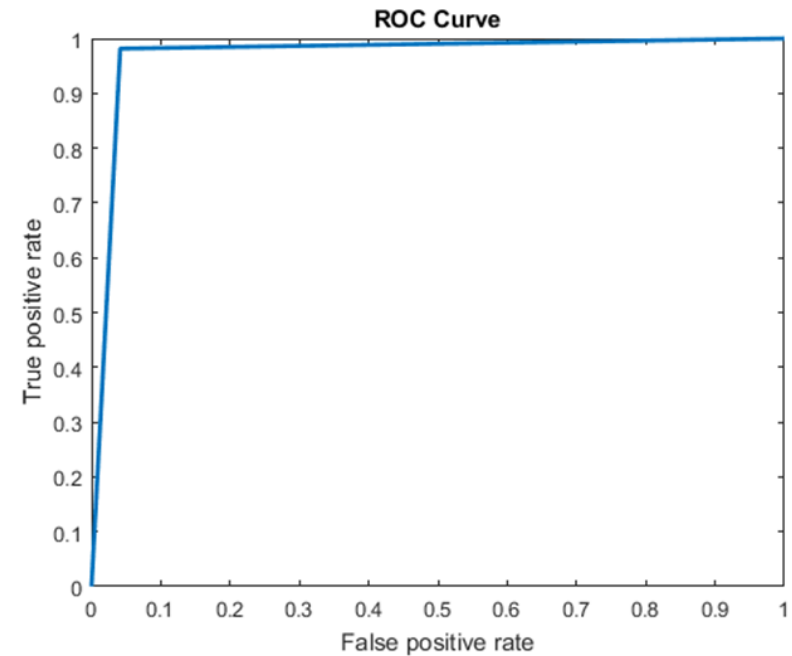
# RESULTS.

## confusion matrix: Complex Decision Trees



Performance of model :

	Predicted 0	Predicted 1
Actual 0	95.86% (87996)	4.14% (3803)
Actual 1	1.84% (1109)	98.16% (59057)



## SUMMARY.

Learning must always be carried out from the beginning of the measurements, no adaptive learning

Generate C code from the learned algorithm possible

Fast results with little previous knowledge