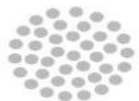


LOGISTICS FOR DEFENSE

**VIBRATION ANALYSIS FOR ROTATING
MACHINES HEALTH MONITORING**

2017/05/09



indra

José Barriga Mangas
Telecommunication Engineer

Index

01 Key Takeaways

02 Introduction to Organization and Business

03 Innovation Challenges and Achievements

04 How did we get there and leverage MathWorks

05 Further details on solution adopted

- Vibration signal analysis
- Model Training
- Model Predicting

06 Concluding Remarks

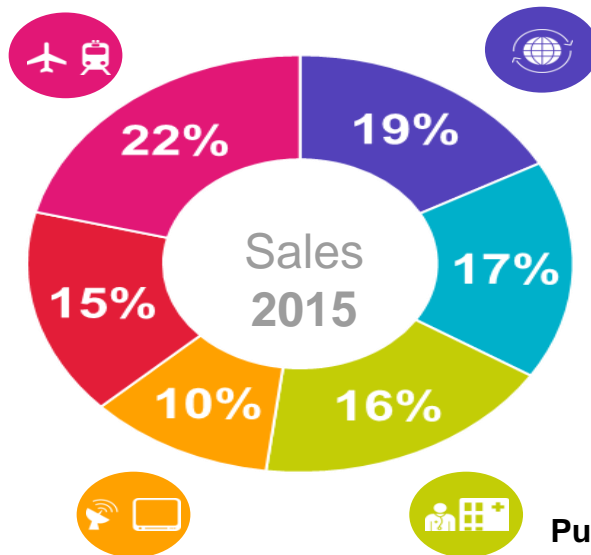
KEY TAKEAWAYS

1. Time-consuming signal analysis task reduced to minimum.
2. Easy management of large amount of data.
3. Machine Learning Models development and deployment.

INDRA ORGANIZATION

Transport & Traffic

- Air Traffic Management systems and Communications, Navigation and Surveillance systems
- Railway & airport management systems
- Urban traffic systems, highways, tunnels and traffic control systems



Defense & Security

- Air surveillance
- Military simulation
- Maritime surveillance
- Electronic Defense
- Satellite Communications
- **Logistics for Defense**

Financial Services

- Insurance and banking core systems
- Operations transformation and process efficiency services

Public Admin & Healthcare

- Healthcare management platform
- Educational and justice management systems
- Comprehensive offer on electoral processes

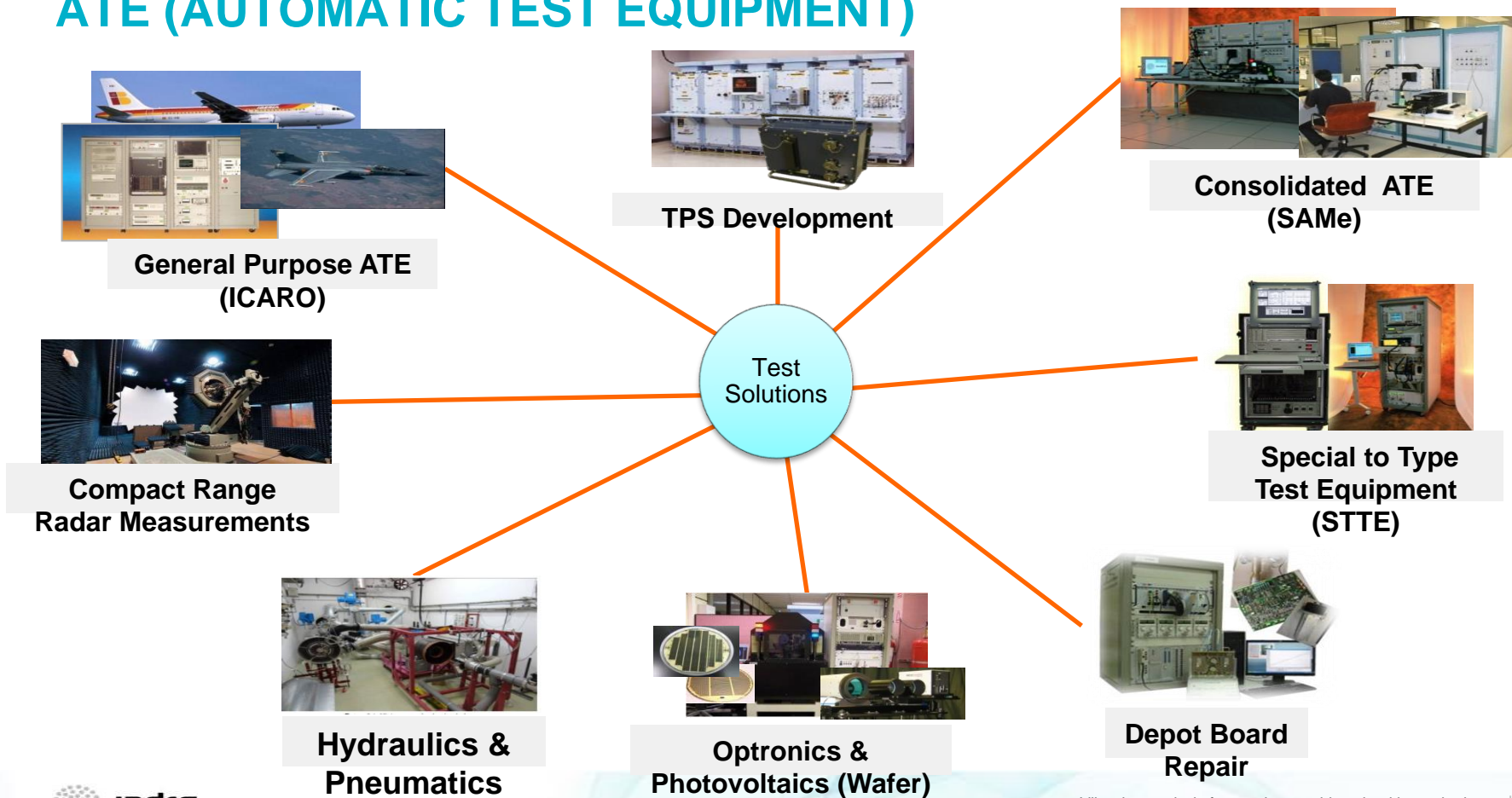
Telecom & Media

- Operations and business support systems
- New media and digital television solutions

Energy & Industry

- Energy: generation, distribution and commercial management solutions
- Industry management solution for hotels

ATE (AUTOMATIC TEST EQUIPMENT)



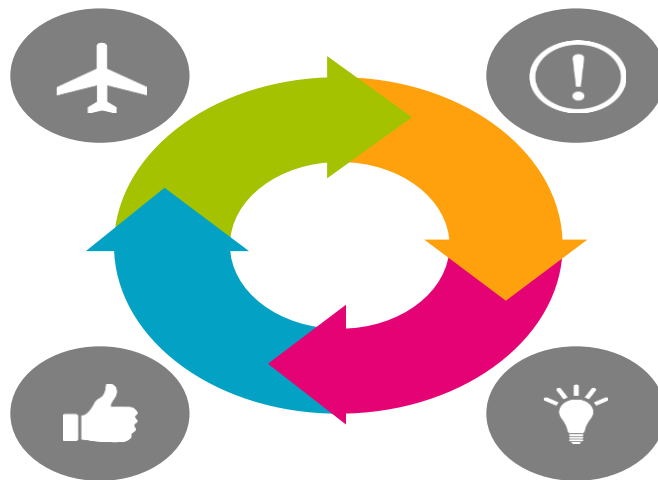
CASE STUDY

Avionic UUT

- Becomes blocked
- Mechanical test

ATE

- New development
- Test result uncertainty



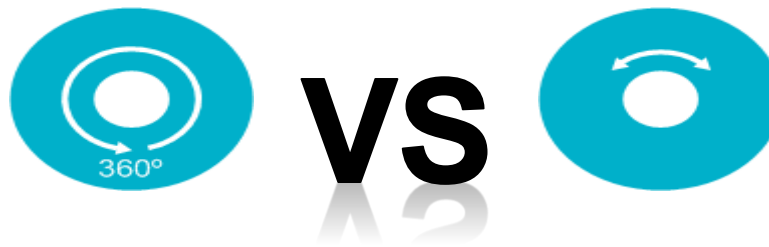
Deployment

- New STTE
- Re-use development algorithms

R&D

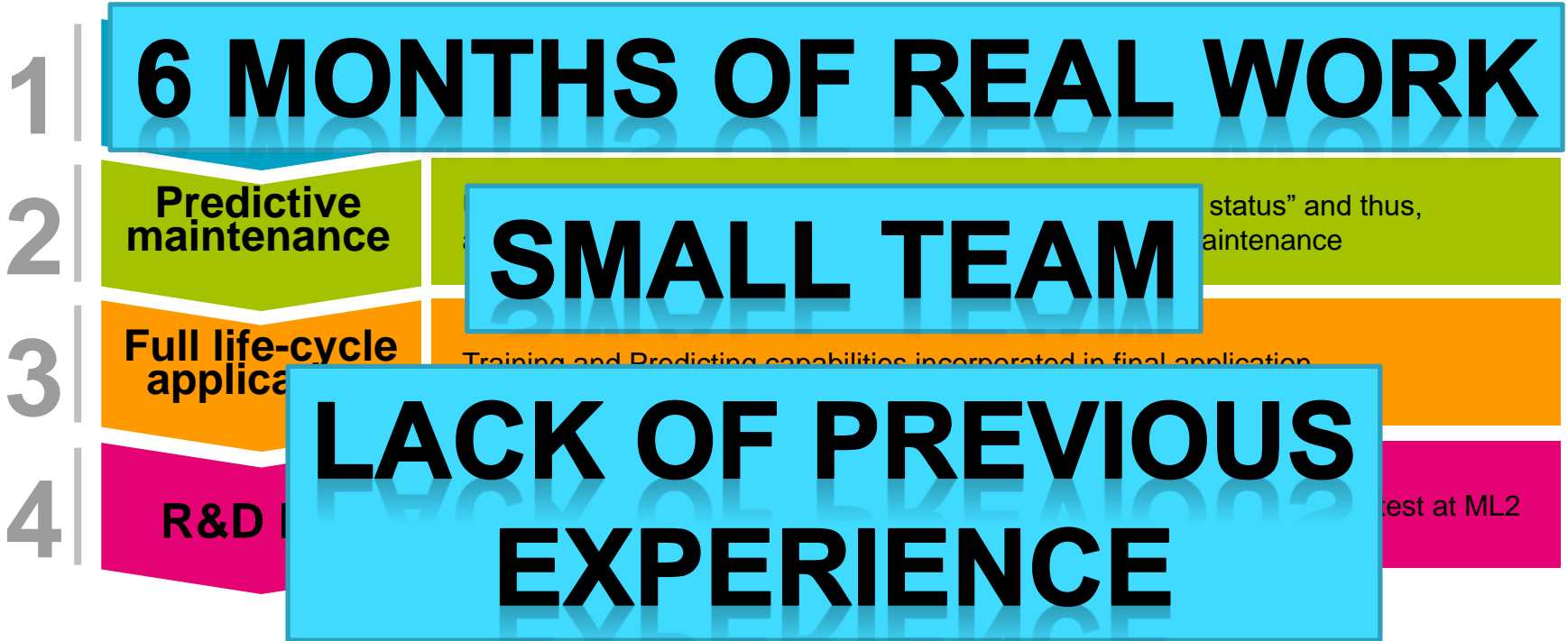
- What we can measure
- How we can test

CHALLENGES

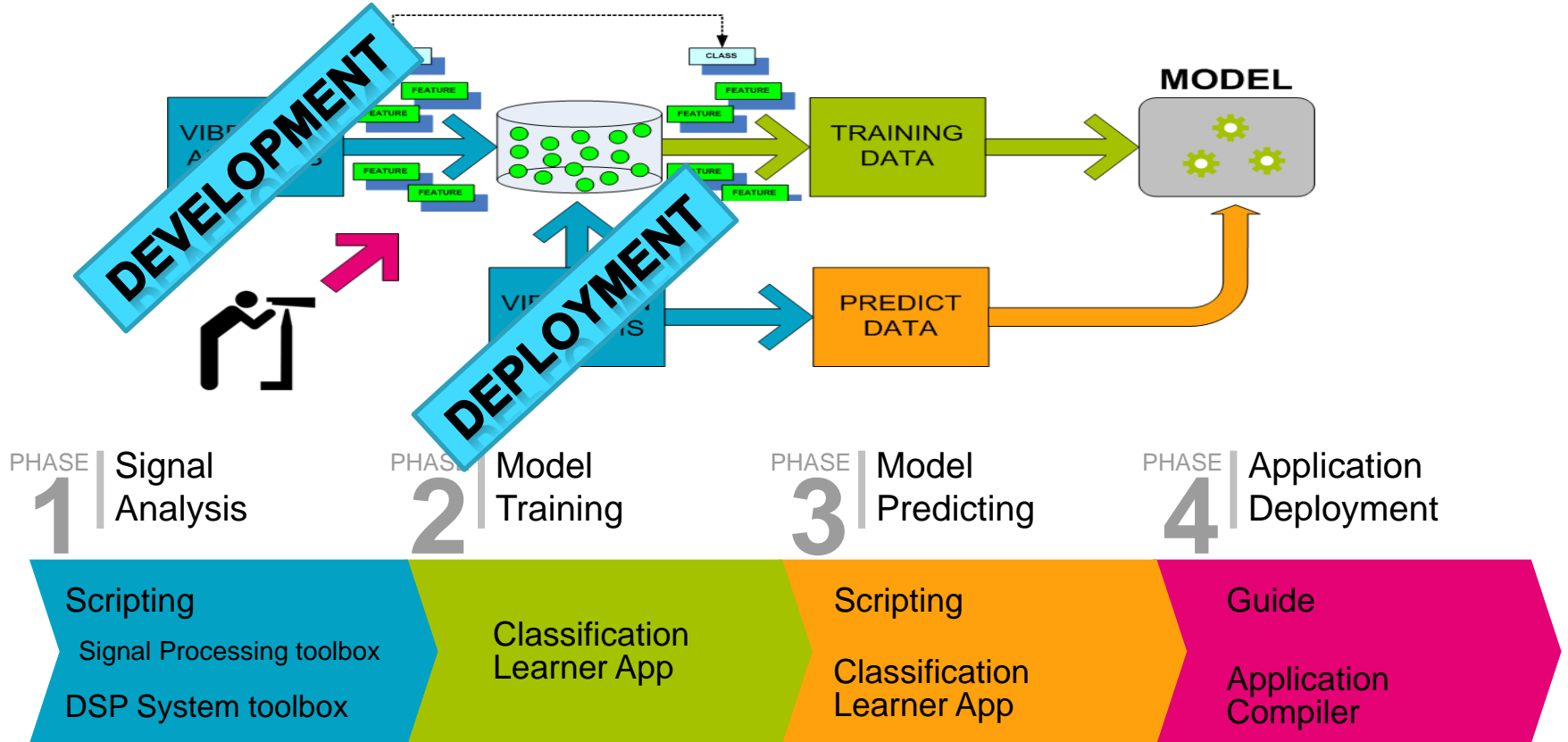


	360° rotating	Limited angle
State of the art	Advanced signal processing about previous solutions	Poor information about existing solutions
Testing	Fixed speed	Variable speed
Signal analysis	Stationary	Non stationary
Features	Time-Invariant	Time-Variant

ACHIEVEMENTS



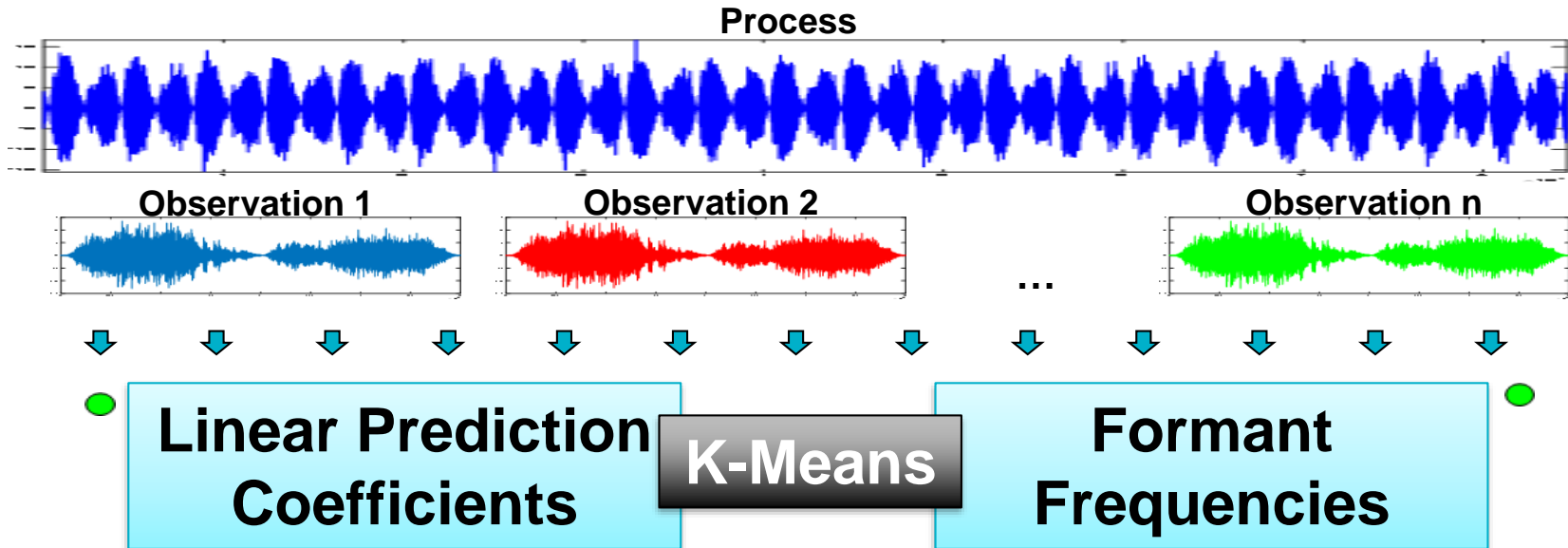
PROJECT PHASES



AUDIO SIGNAL PROCESSING

Vibration pre-processing

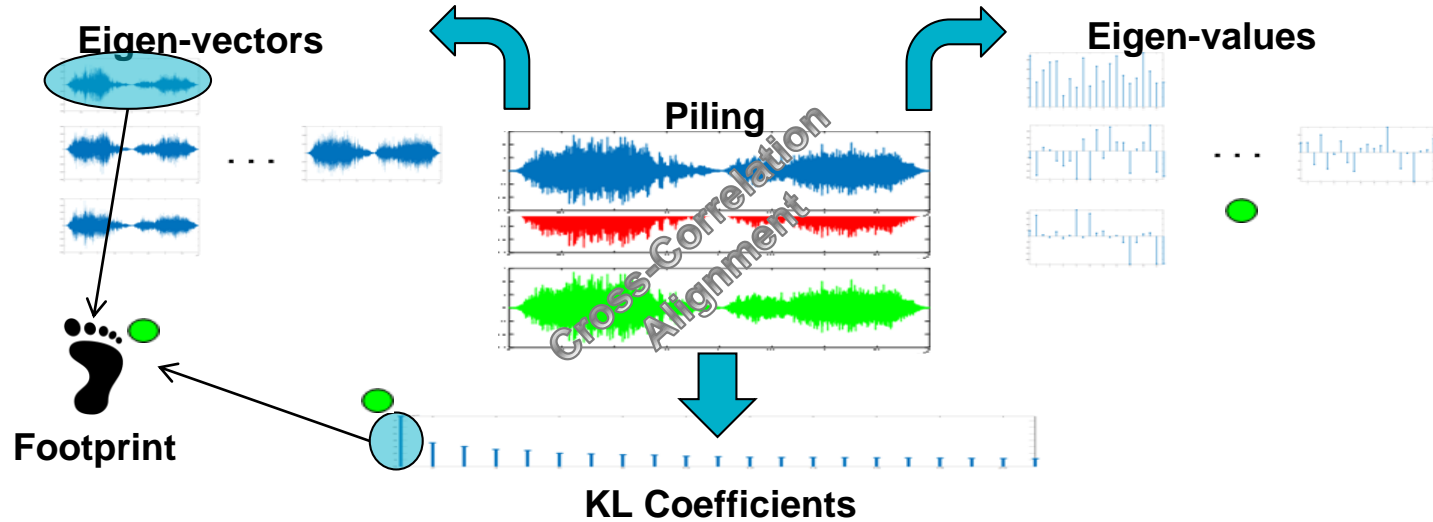
- Split vibration signal into sub-signals suitable to be analyzed.
- “Smart” partitioning to obtain portions sharing the same features.



DECONSTRUCTION

Karhunen–Loève Transform

- Closely related to Principal Component Analysis (PCA)
- Breaks down a set of signal into orthogonal sub-signals based on correlation

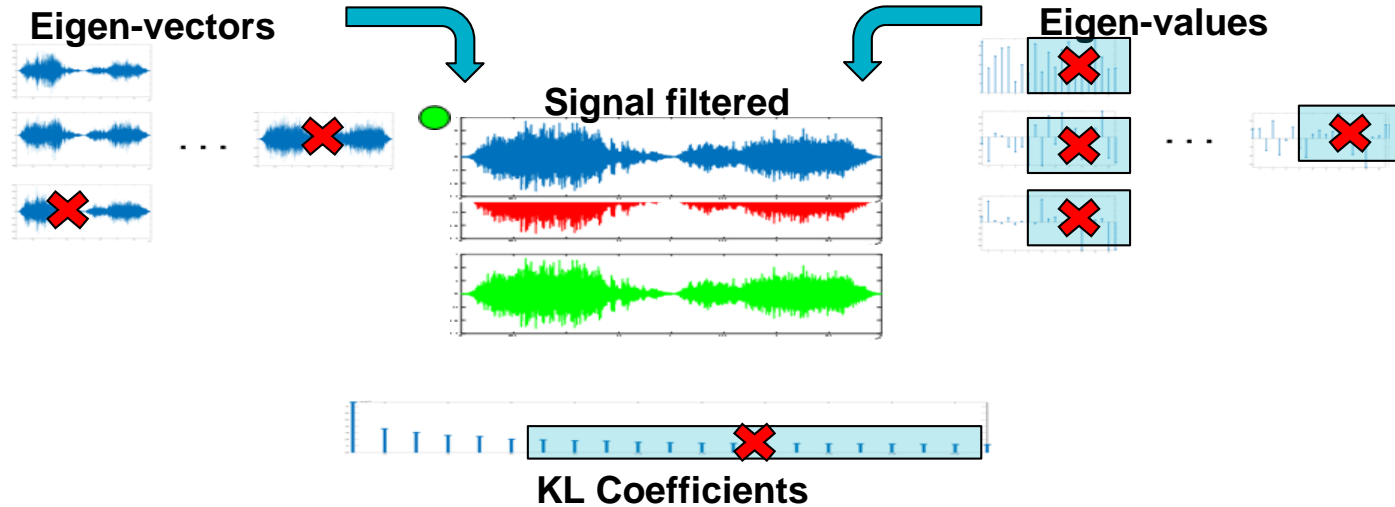


Signal Analysis

RECONSTRUCTION

Smart Filter

- Signal re-composition based on % of the variance
- Spectra analysis of the filtered signal

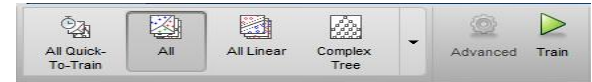


Signal Analysis

CLASSIFICATION LEARNER APP

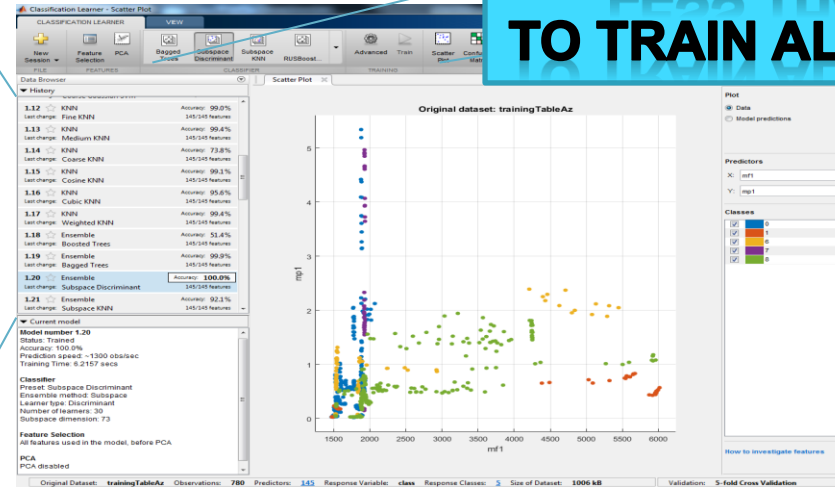
Fast and easy comparison between classifiers

- 1-Click training up to 23 different classifiers
- Cross-Validation to protect against over-fitting
- Accuracies between 50% and 100%



**LESS THAN 30 SECS
TO TRAIN ALL CLASSIFIERS**

1.12	KNN	Accuracy: 99.0%
Last change: Fine KNN		145/145 features
1.13	KNN	Accuracy: 99.4%
Last change: Medium KNN		145/145 features
1.14	KNN	Accuracy: 73.8%
Last change: Coarse KNN		145/145 features
1.15	KNN	Accuracy: 99.1%
Last change: Cosine KNN		145/145 features
1.16	KNN	Accuracy: 95.6%
Last change: Cubic KNN		145/145 features
1.17	KNN	Accuracy: 99.4%
Last change: Weighted KNN		145/145 features
1.18	Ensemble	Accuracy: 51.4%
Last change: Boosted Trees		145/145 features
1.19	Ensemble	Accuracy: 99.9%
Last change: Bagged Trees		145/145 features
1.20	Ensemble	Accuracy: 100.0%
Last change: Subspace Discriminant		145/145 features
1.21	Ensemble	Accuracy: 92.1%
Last change: Subspace KNN		145/145 features



Model Training

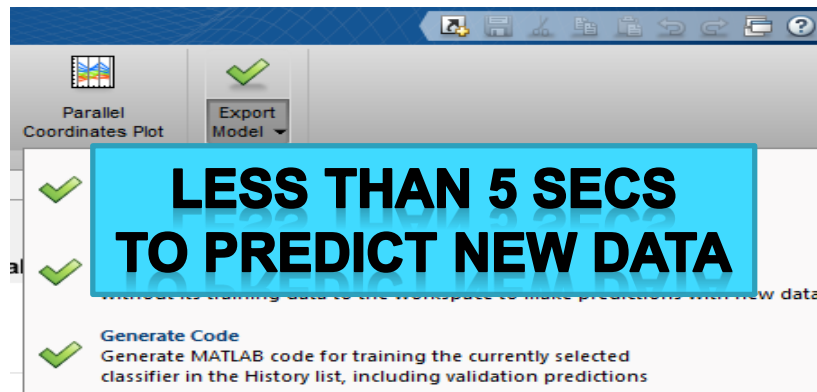
MATLAB READY TO USE CODE

Export selected classifier

- Fast code deployment.
- Easy understanding (OOP)

Classifier model can be re-trained with new data set.

- Full try and check capabilities in final tool.
- Post-development clean data set can be used to train.



Model Predicting

RE-TRAINING

Custom UI

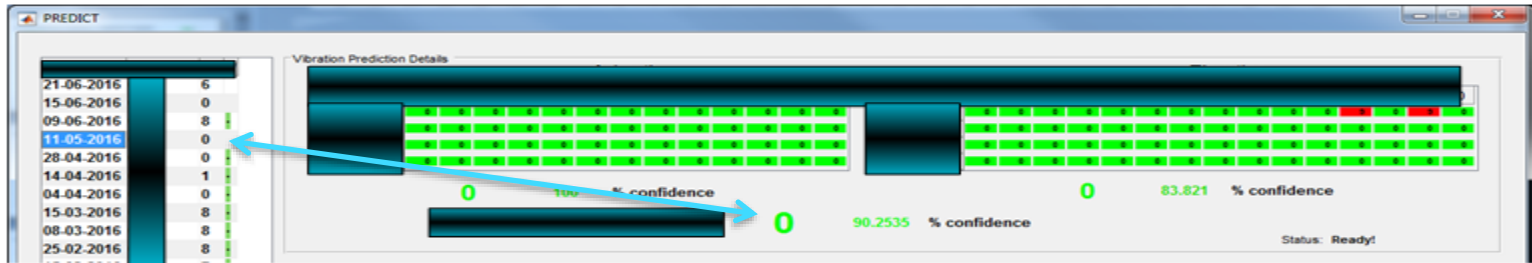
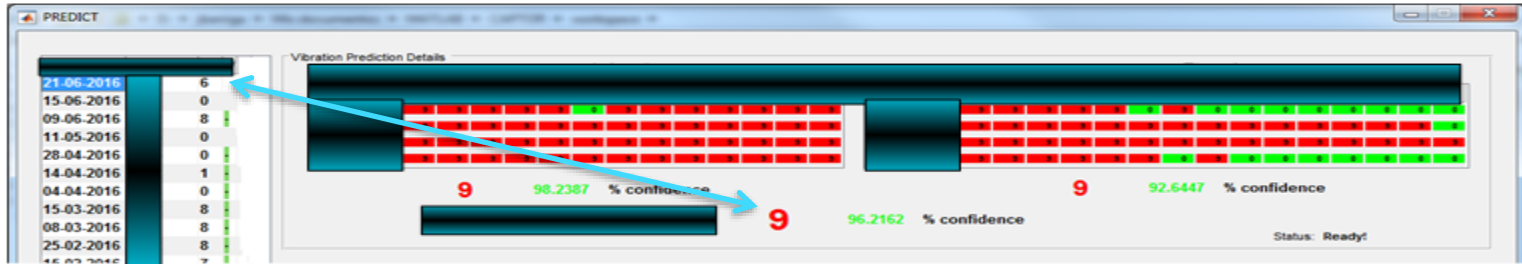
- Custom User Interface to select data set for training.
- Go/NoGo or By Level training mode.



Application
Deployment

PREDICTING

Custom UI



Application
Deployment

SUMMARY

Particular Signal Analysis

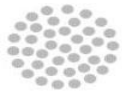
1. Audio signal processing
 - LPC
 - Formants
2. PCA analysis based on KLT
 - Spectrum
 - Coefficients
3. Fourier analysis
 - K-Means
 - Statistic analysis

Key Takeaways

1. Time-consuming signal analysis task reduced to minimum.
2. Easy management of large amount of data.
3. Machine Learning Models development and deployment.

SUMMARY

- Best practices
 - Classification Learner App
 - SVN
- Recommendations
 - OOP
 - MATLAB Scripting
- Future plans
 - Reduce amount of test per unit
 - Network of classifiers to improve prediction
 - Embedded auto diagnostic
 - New topic-related projects



indra

José Barriga Mangas

Logistics For Defense / ATE

jbarriga@indra.es

C/ Mar Egeo 4
28830 San Fernando de Henares,
Madrid España
www.indracompany.com