

# WORK PACKAGE 3.1

## APPROACHES FOR DIAGNOSTICS AND PROGNOSTICS

CONTROL THEORY AND APPLICATIONS CENTRE  
COVENTRY UNIVERSITY

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2015

**EPSRC**  
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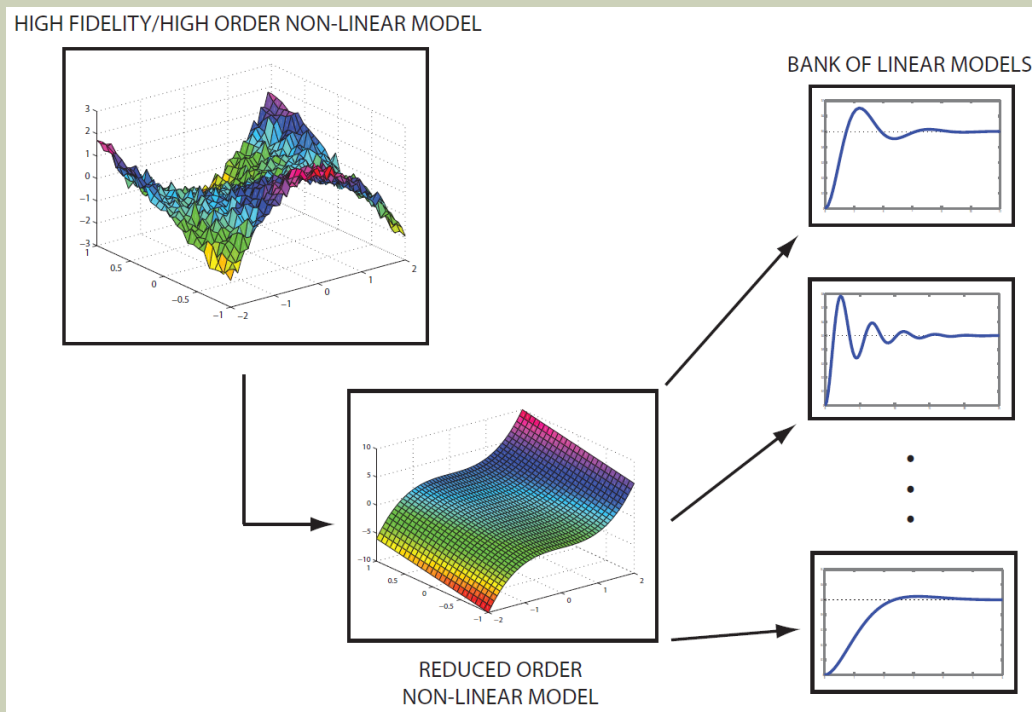
**Imperial College**  
London

**UNIVERSITY OF**  
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**The University**  
**Of Sheffield.**

# INTRODUCTION

- Aim – to reduce computational complexity of model yet retain sufficient accuracy for a specific purpose, i.e. control, **diagnostics**, **prognostics**

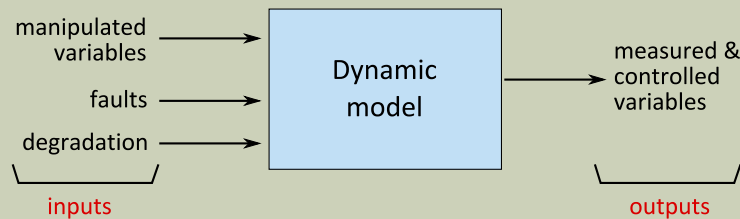


# CONTENT

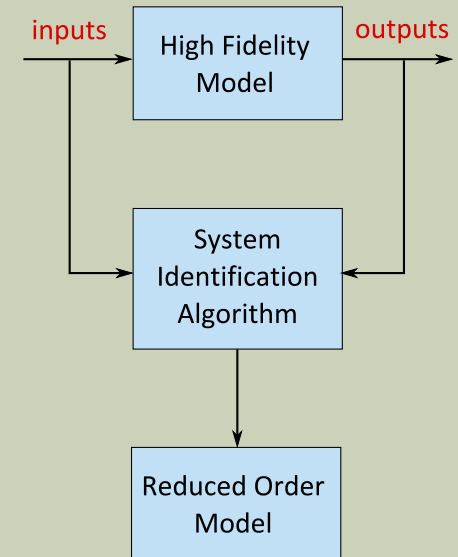
- Model based approach to diagnostics
- Case study: diagnosis of proton exchange membrane(PEM) fuel cell
- Fault diagnostics and prognostics – data driven approach
- Case study: bearing data remaining useful life (RUL) estimation

# MODEL-BASED APPROACH FOR DIAGNOSTICS

- Faults and degradation represented as additional inputs to the system



- High Fidelity Model used as a surrogate of real-world system
- Reduced order model identified from input and output data
- Fault detection and diagnosis filter designed to detect and identify faults and degradation





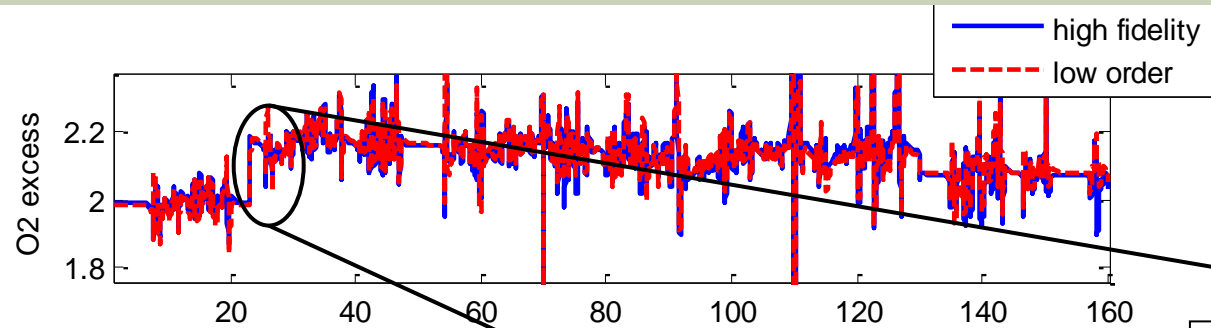
# FUEL CELL DIAGNOSTICS

- Multiple-input multiple-output model:
  - **Inputs:** stack current and compressor voltage
  - **Outputs:** net power, stack voltage, excess oxygen ratio (oxygen flow into cathode/oxygen reacted)
  - **Induced faults:**
    - Actuator fault – variation in compressor voltage/efficiency simulating surge/choke affecting air flow to the supply manifold
    - Supply manifold fault – variation of supply manifold pressure to represent air leakage
    - Fuel cell stack fault – cathode exit flow rate blockage to simulate flooding
- Steady state feed-forward controller for compressor voltage to maintain oxygen excess ratio of 2

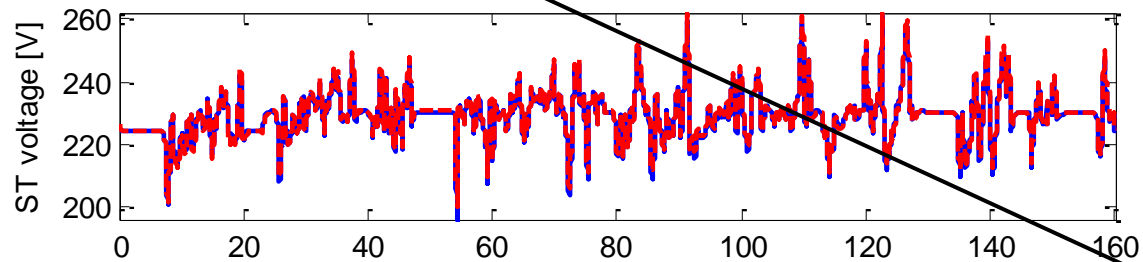
# FUEL CELL DIAGNOSTICS

- Response of reduced order model

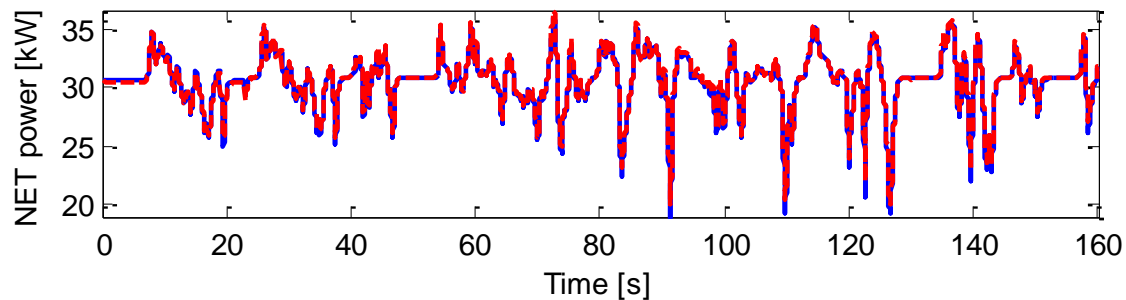
$R_T^2 = 92.0$



$R_T^2 = 99.0$

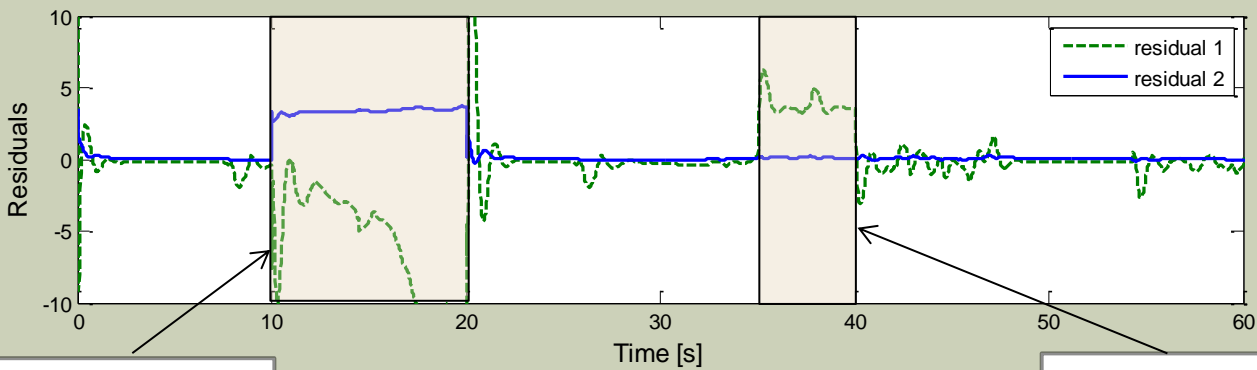
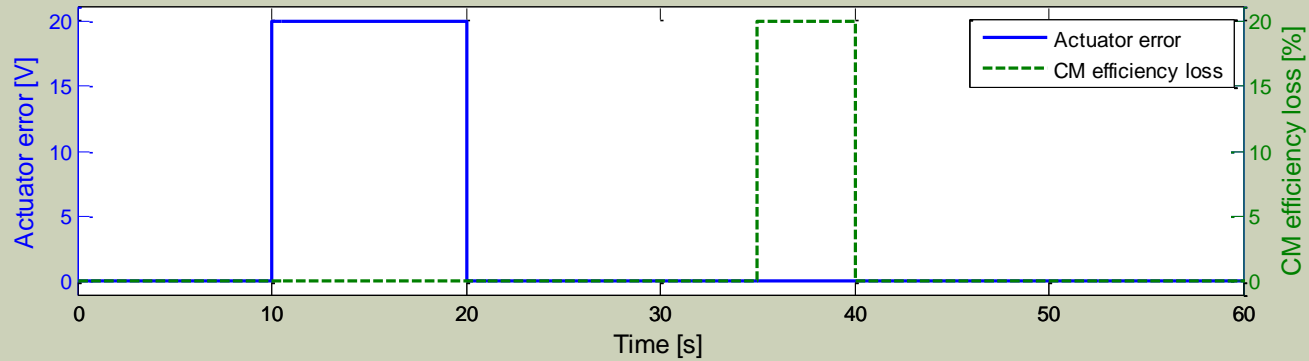


$R_T^2 = 99.3$



# FUEL CELL DIAGNOSTICS

- Fault detection and isolation observer

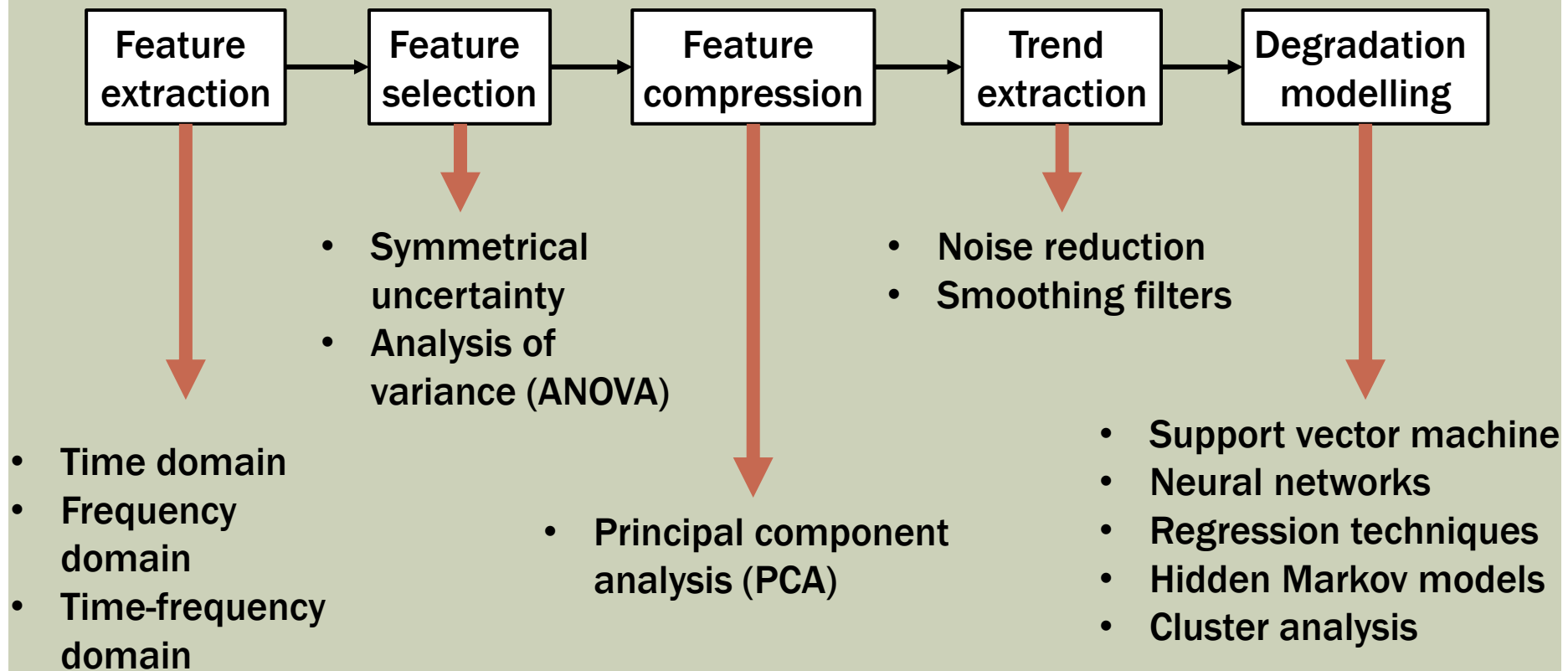


**Actuator fault detected**

**Compressor efficiency loss detected**

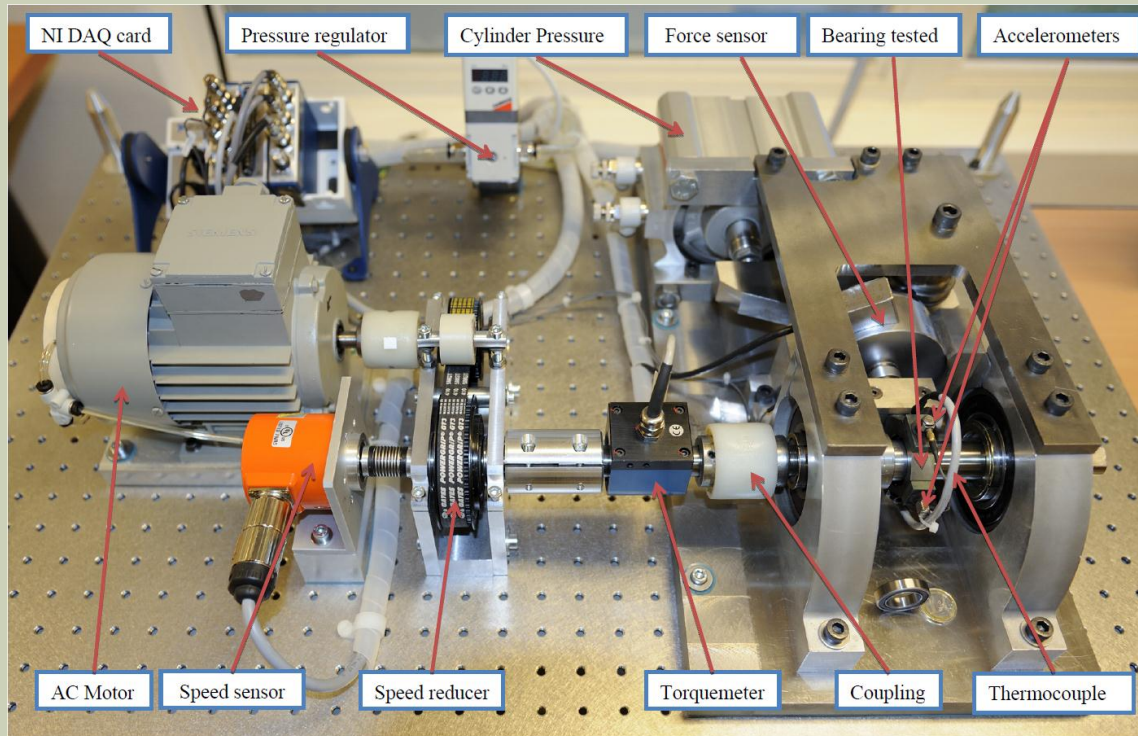


# FAULT DIAGNOSTICS AND PROGNOSTICS – DATA DRIVEN APPROACH



# BEARING DATA CASE STUDY

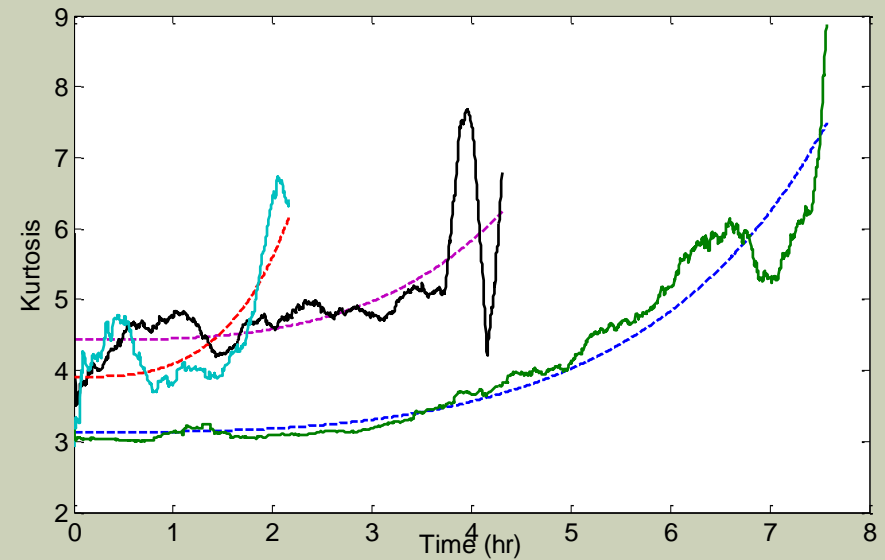
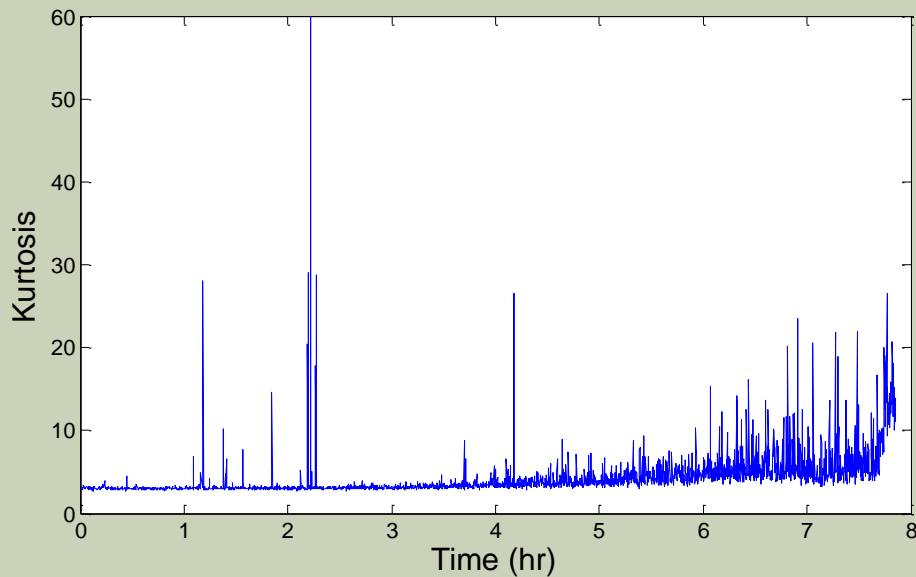
- PRONOSTIA experimentation platform: FEMTO-ST Institute
- Run-to-failure experiments



P. Nectoux, R. Gouriveau, K. Medjaher, E. Ramasso, B. Morello, N. Zerhouni, C. Varnier. PRONOSTIA: An Experimental Platform for Bearings Accelerated Life Test. IEEE International Conference on Prognostics and Health Management, Denver, CO, USA, 2012

# KURTOSIS

- $\beta = \frac{\int_{-\infty}^{+\infty} (x - \bar{x})^4 P(x) dx}{\sigma^4}$
- Undamaged bearing:  $\beta = 3$



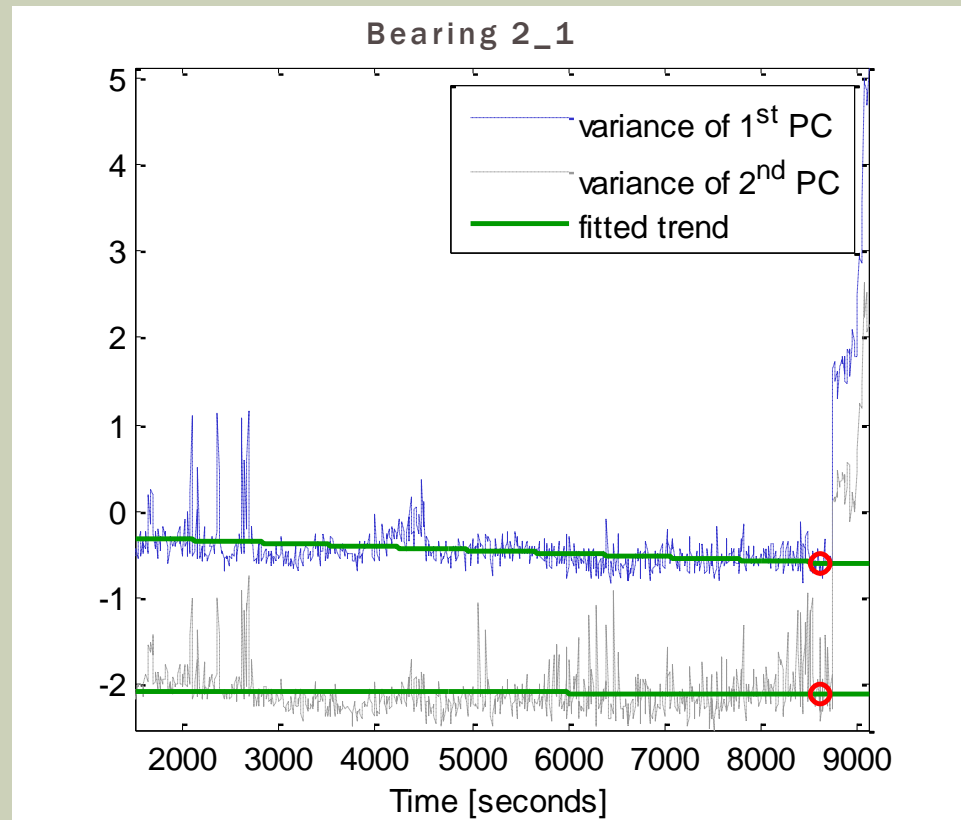
# RUL MODELLING

## ■ *RUL modelling*

- Variance of principal components of displacement exhibits descending trend until failure

$$trend = a \cdot time + b$$

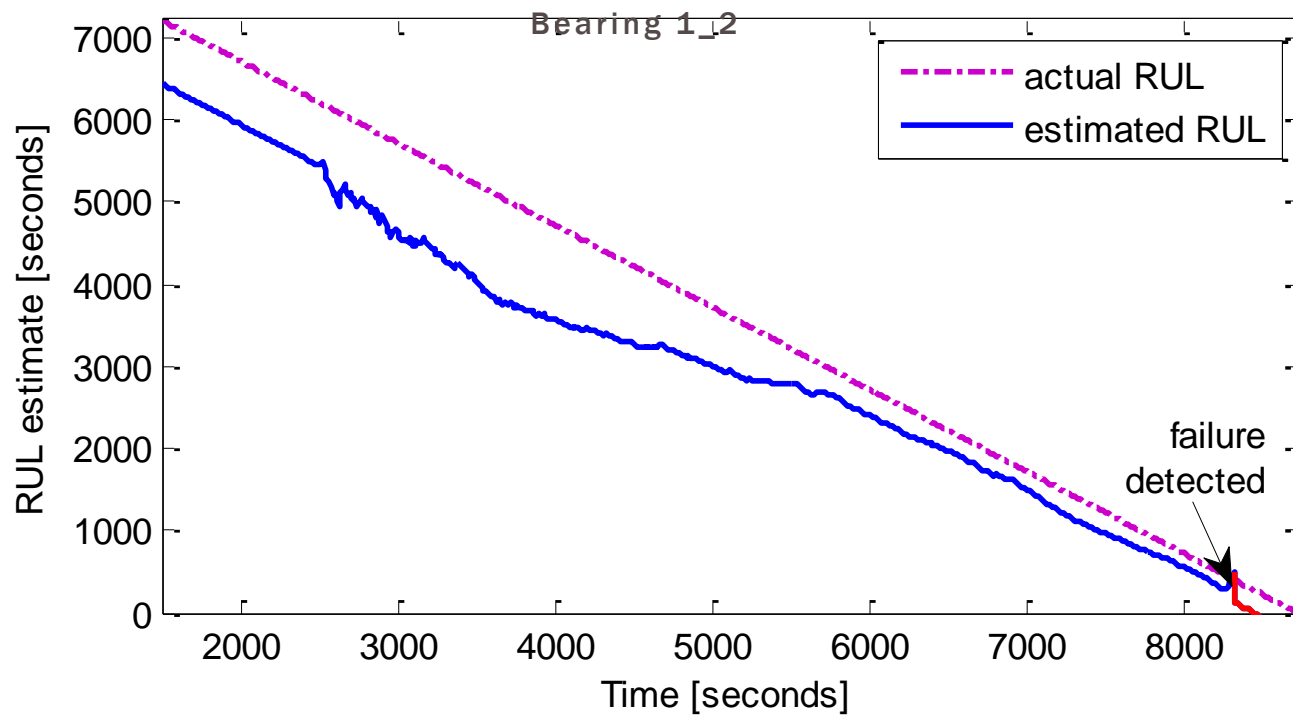
- Analysed dependency between parameters  $a$ ,  $b$  and bearing life



# RUL MODELLING

## ■ *Estimated RUL*

- 3 estimation data sets
- 1 validation set



# SUMMARY

- Knowledge and understanding of elements required for a unified approach to condition based maintenance framework
- Initial investigation of various methods for fault diagnostics and remaining useful life prognostics
- Fuel cell and rolling element bearings case studies used to examine and validate algorithms

Further work –

- Develop generalised set of algorithms for diagnostics and prognostics
- Demonstrate algorithms on additional case studies
- Investigate applicability for online implementation of reduced order models for control, diagnostics and prognostics