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# A new model based method for generating superior endpoint traces using full range optical emission spectroscopy

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- Introduction
- Comparison of common used endpoint detection methods
- Model based approach for design of endpoint traces
  - Unfolded PCA - a basis for spectral information extraction
  - Regularization techniques for endpoint pattern design
- Application to production data
- Summary





- complex plasma interactions are indicated by the radiation of reactant gases, that qualifies OES as a superior method for
  - endpoint detection
  - process supervision and process control
- generally, a lot of different influences (chamber pollution, condition, process variations) are superimposed to the endpoint information in spectral data
- most of the common endpoint algorithms are not able to compensate such a wide variety of different influences

**challenge:** extraction of suitable endpoint traces  
from high dimensional spectral data

## main tasks:

### 1. Generation of an endpoint relevant time signal

- use of photo multiplier with fixed optical filter
- use of spectroscope using CCD line image sensor

### 2. Detection of the endpoint time

- definition of relative/absolute thresholds
- heuristic algorithms (graphical differentiation )
- model based methods
- qualitative signal analysis

➔ design of a suitable endpoint signal is most important for a reliable EP detection

# Comparison of Methods for Endpoint Detection

→ Generation of endpoint relevant time signals

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- „single/dual wavelength“ analysis
  - use of a-priori knowledge about the chemical interactions
- analysis of the statistical variance
  - simple key numbers
    - spectral total power
    - general power
  - PCA based algorithm
    - $T^2$ , Q;
    - Evolving Window Factor Analysis (EWFA)
    - Principle Component Orientation
- generation of a specific endpoint sensitive spectral pattern
  - weighting of the entire spectral range depending on specific wavelength („spectral software filter“)

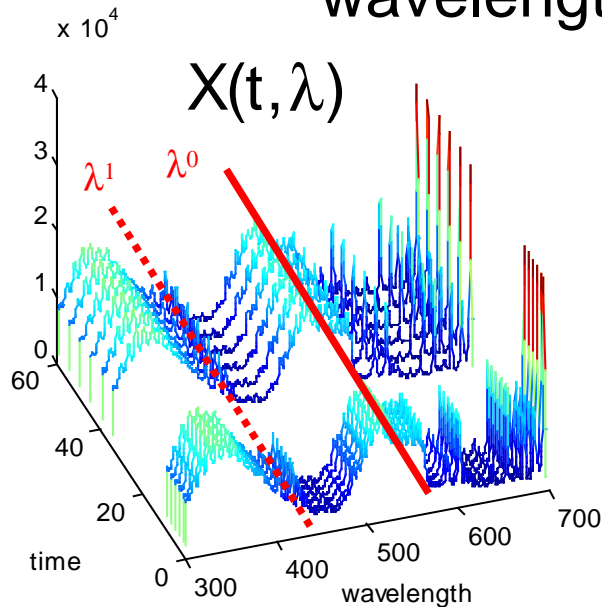


# Comparison of Methods for Endpoint Detection

→ single/dual wavelength analysis

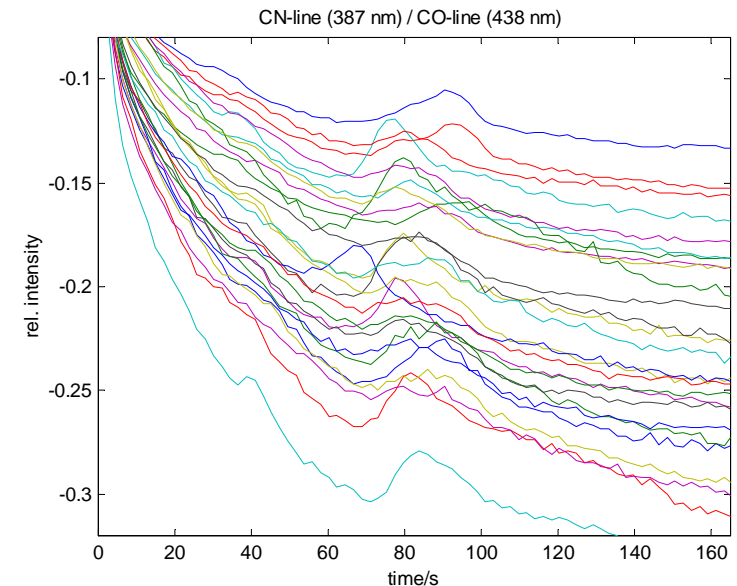


philosophy: assessment of spectral changes within individual wavelengths or ranges



$$y(t_i) = X(t_i, \lambda^0)$$

$$y(t) = \frac{X(t, \lambda^0)}{X(t, \lambda^1)}$$



- advantages:
  - simple design using a-priori knowledge
  - clear chemical interpretation of EP signal
- disadvantage: - waste of spectral information

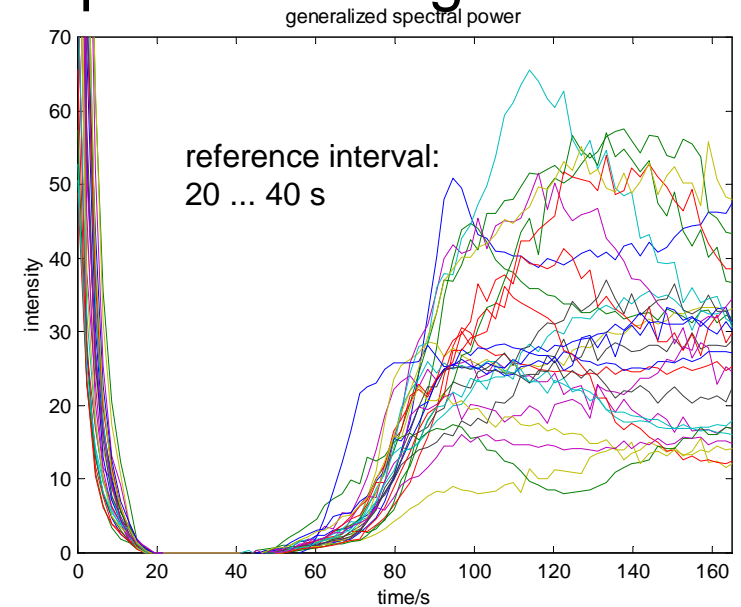
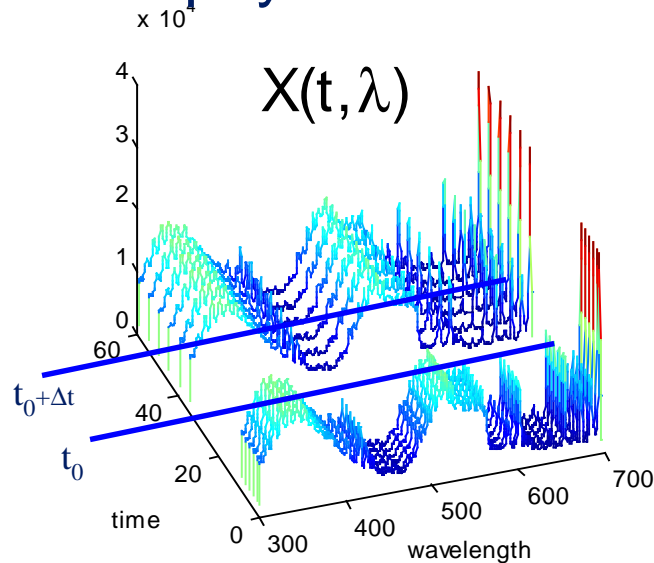


# Comparison of Methods for Endpoint Detection

→ analysis of statistical variance – simple methods



philosophy: assessment of general spectral changes



→ simple methods:  $y(t_i) = x(t_i)^T \cdot W \cdot x(t_i)$   $W$ : unit or inv. covariance matrix

- advantage: - simple design and on-line calculation
- disadvantage: - unspecific sensitivity to all spectral changes  
- suitable only for large open-area

# Comparison of Methods for Endpoint Detection

→ analysis of statistical variance – PCA based methods



philosophy: statistical assessment of specific spectral changes

$$\text{EWFA: } y(t_i) = \delta_n \{x(t_i) \cdots x(t_i + \Delta t)\}$$

$$\text{PCO: } y(t_i) = u_n \{x(t_0) \cdots x(t_0 + \Delta t)\}^T \cdot u_n \{x(t_i) \cdots x(t_i + \Delta t)\}$$

$$\text{T}^2, \text{Q: } y(t_i) = \|x(t_i)\|^2 - \|u_{1..n} \{x(t_0) \cdots x(t_0 + \Delta t)\} \cdot x(t_i)\|^2$$

$\delta_n$ : n-th singular value;  $u_n$ : n-th eigenvector of  $(X^T X)$

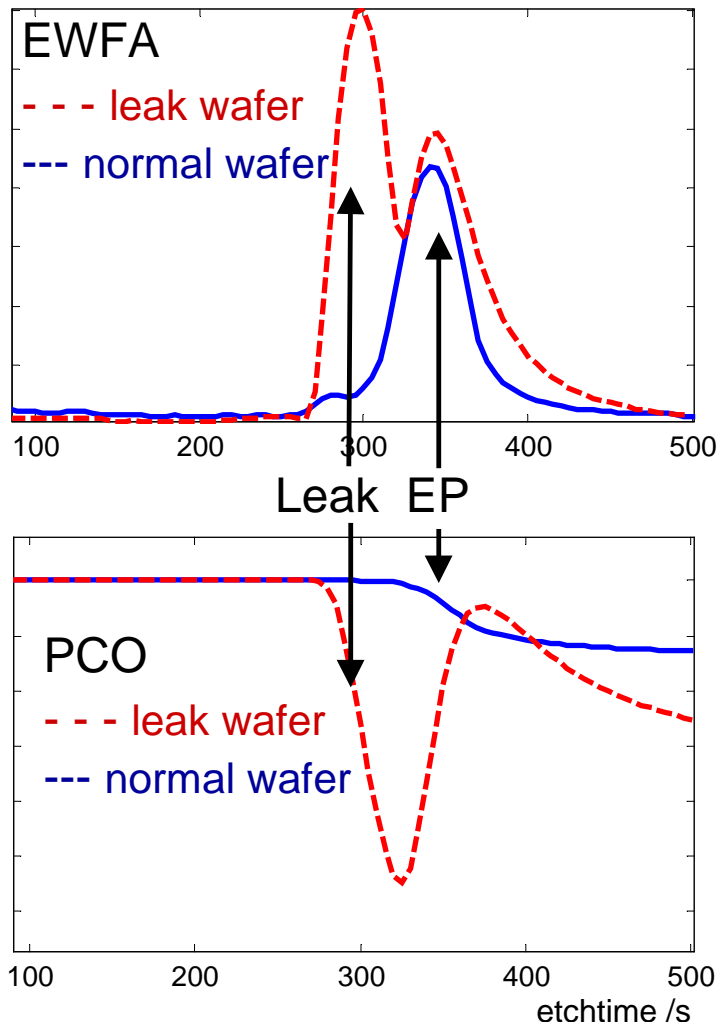
- **advantages:** - enables to detect small spectral changes
- **disadvantages:** - EP-signal  $y(t)$  strongly depends on:
  - selection of n-th eigenvector resp. eigenvalue
  - selection of reference period of time  $\Delta t$
  - the reasons of changes in resulting EP-signal are difficult to assess

➡ not necessarily endpoint relevant !



# Comparison of Methods for Endpoint Detection

→ analysis of statistical variance – PCA based methods



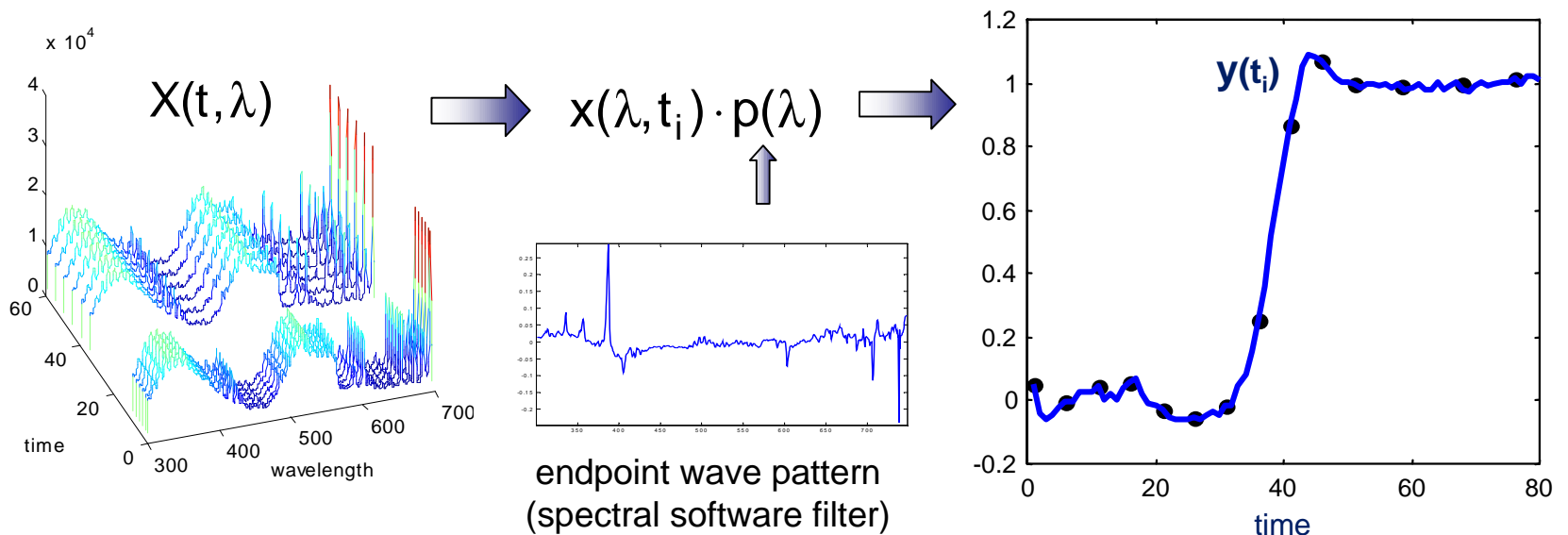
- PCA methods are sensitive to various kinds of plasma changes
- the signal changes at EP as well as at leak
- calculation of EP-Signals require complex mathematical methods and computational power

# Comparison of Methods for Endpoint Detection

→ Generation of EP-signal using spectral software filter



philosophy: calculation of the EP signal by multiplication of the spectral data with an endpoint sensitive spectral pattern



challenge: generation of a suitable wave pattern which yields to sensitive and long-term robust endpoint signals

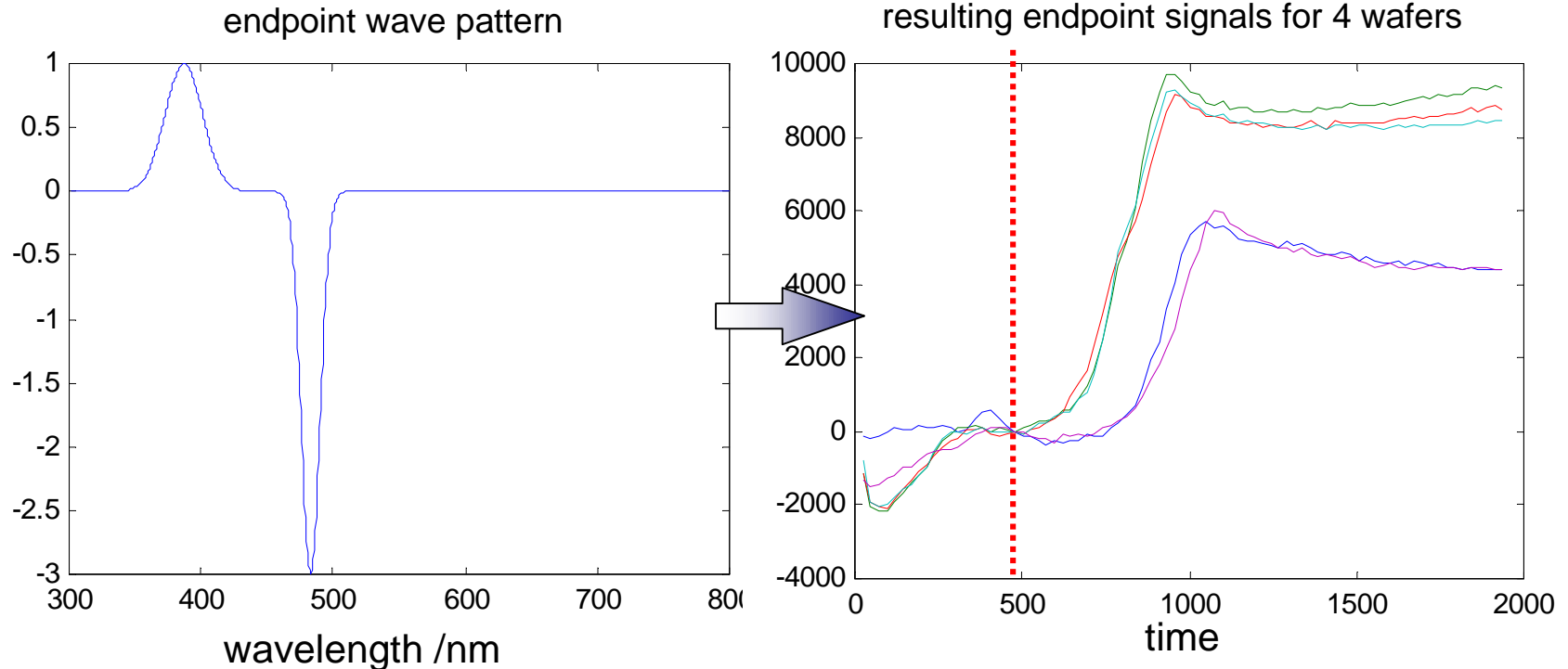


# Comparison of Methods for Endpoint Detection

→ example for manual endpoint pattern design



example for a simple endpoint pattern design (spectral software filter)



→ a manual design of an endpoint sensitive wave pattern is possible by using a-priori knowledge about the chemical plasma interactions

# Model based approach for Endpoint Design

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**objective:** automatic synthesis of a spectral pattern, which yields to a sensitive and robust EP-signal

**methods:** formulation of a parameter estimation problem based on a predefined endpoint trace

**problems:**

- ill conditioned spectral data (strong correlated data)
- underdetermined estimation problem
- predefinition of wanted endpoint trace

**solution:**

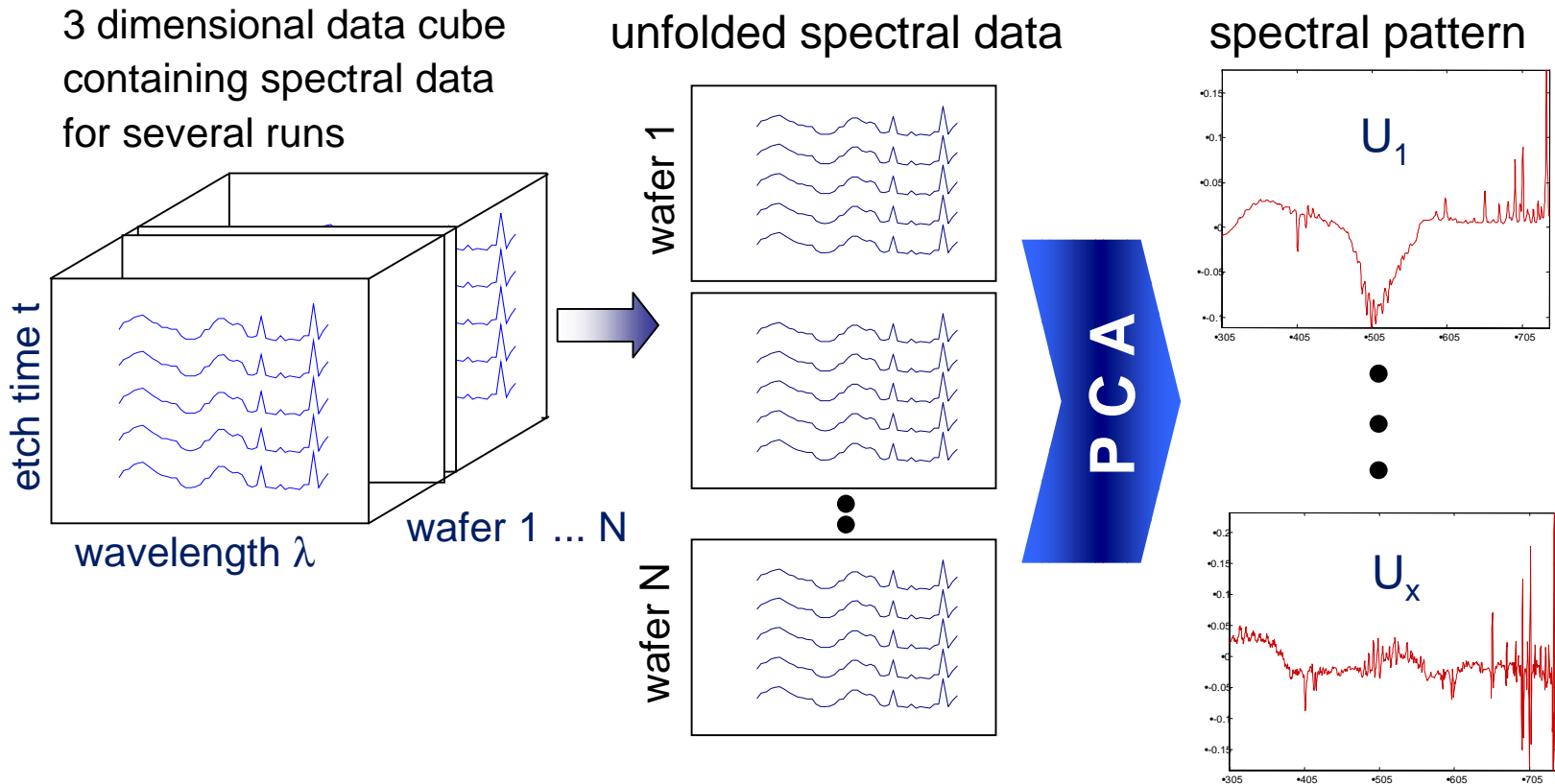
- unfolded PCA for data conditioning
- regularization methods for parameter estimation



# Model based approach for Endpoint Design

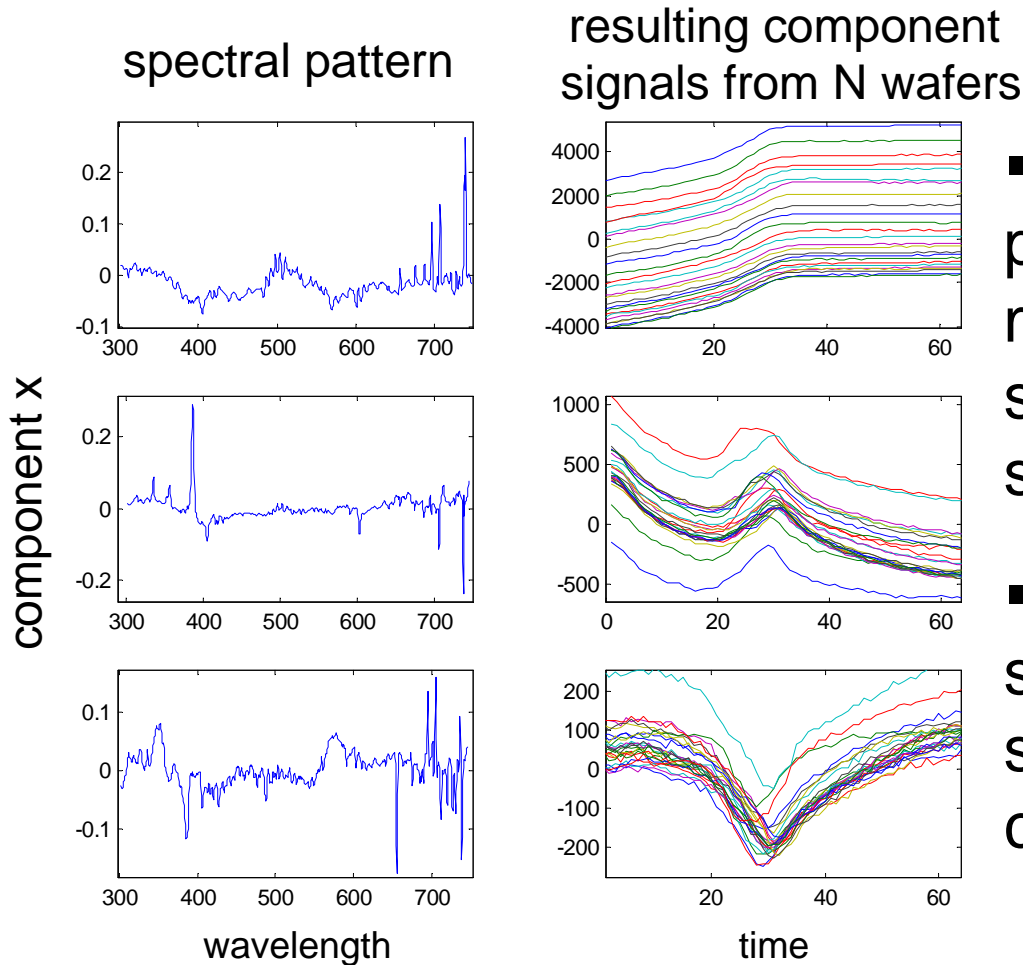
→ Unfolded PCA – a basis for spectral information extraction

philosophy: calculation of orthogonal wave pattern  $u_i$  using PCA after unfolding the original data cube



# Model based approach for Endpoint Design

→ Unfolded PCA – basis for spectral information extraction



- application of spectral pattern to original measured data results in specific component time signals
- generation of endpoint signal by suitable superimposition of the components



# Model based approach for Endpoint Design

## → Regularization



philosophy: smooth adjustment of the condition of the estimation problem to prevent overfitting

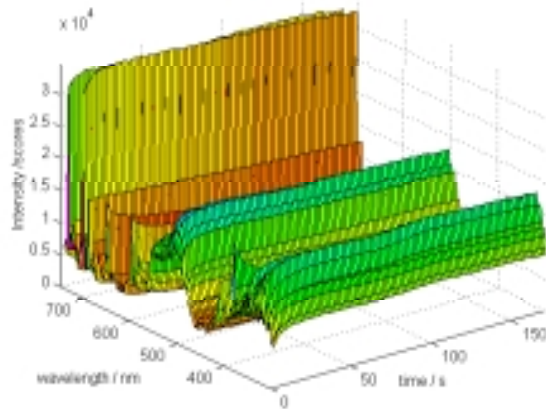
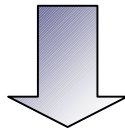
model:  $Xp \sim y$  (X: component signals; y: predef. EP shape)

solution:  $p := (X^T X + I \theta^2)^{-1} X^T y$  (p: est. parameter)

application:  $\lambda = \Lambda p$  ( $\lambda$ : res. wave pattern;  $\Lambda$ : spectral pattern)

→ adjustment of sensitivity parameter  $\theta$  as a compromise between endpoint sensitivity and robustness

# Features of used Hamamatsu Multiband Plasma Monitor



- spectral range: 200 - 950 nm
- resolution: < 2 nm; channel: 1024
- connection to Host PC via TCP-IP
- internal data processing for endpoint detection with a DB for spectral wave patterns and EP-Scripts
- on-line application of spectral wave pattern
- digital / analog ports for connection to tools



# Application to Production Data

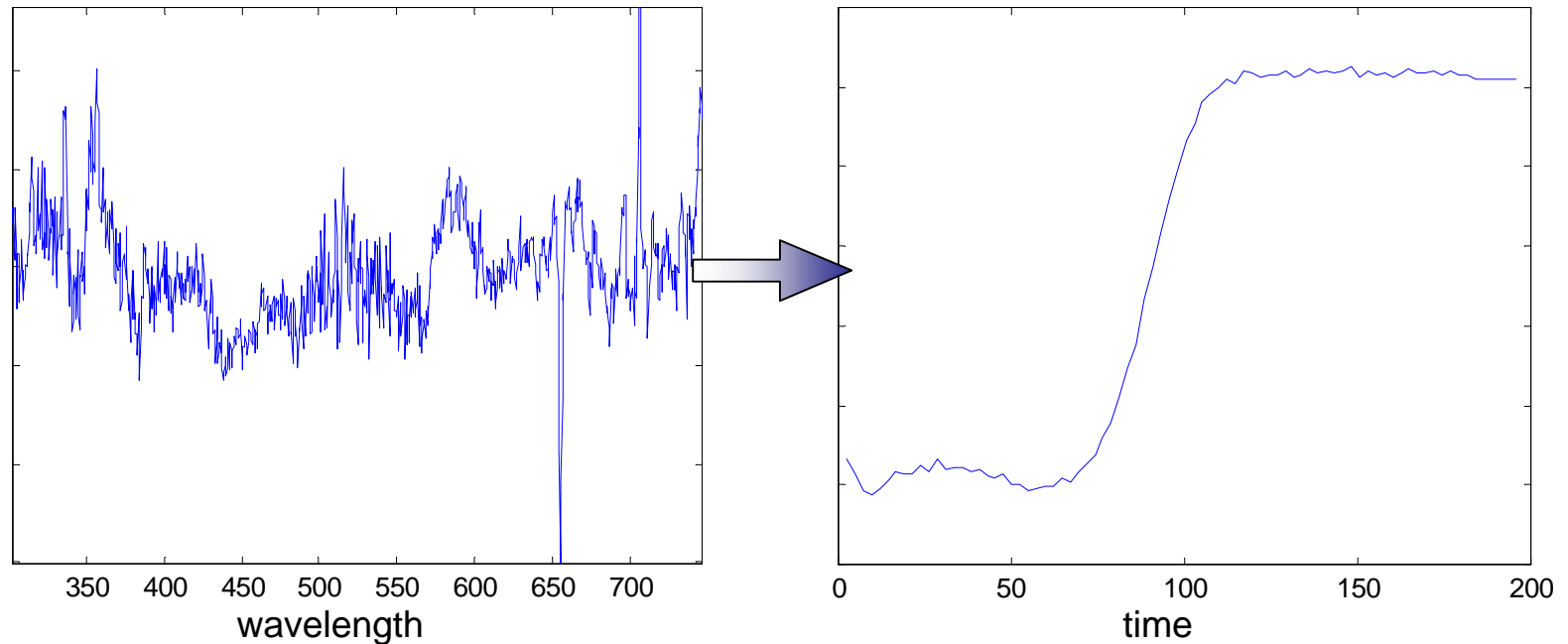
→ long term robustness



objective: synthesis of a suitable pattern using data from  
one etch by adjusting  $\theta$

spectral pattern

resulting endpoint signal



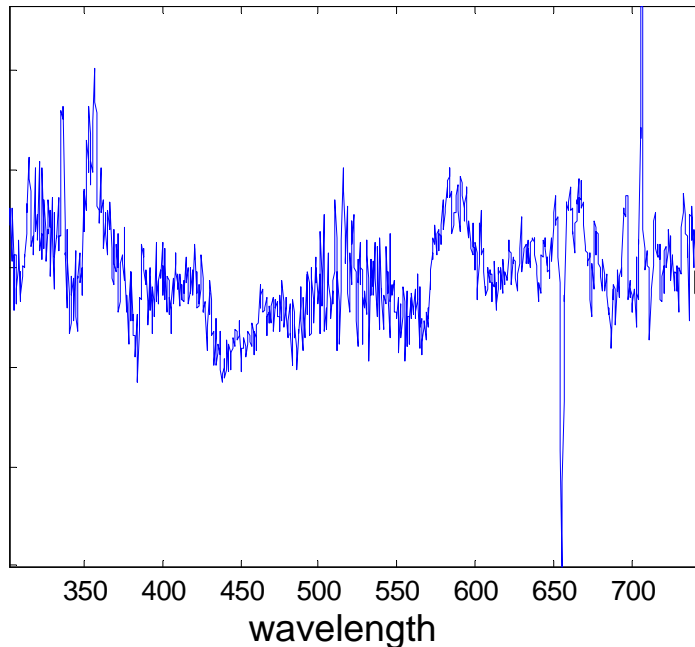
→ to assess the long term robustness the pattern  
is now applied to a set of validation data

# Application to Production Data

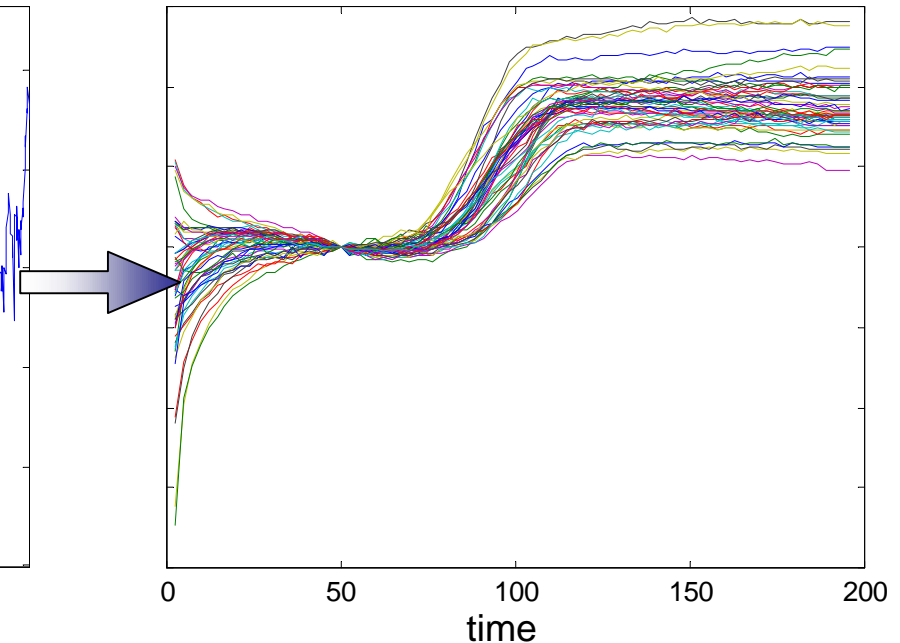
→ long term robustness

validation: application of the generated pattern to a set of spectral data from different Wet Clean cycles

spectral pattern



resulting endpoint signal

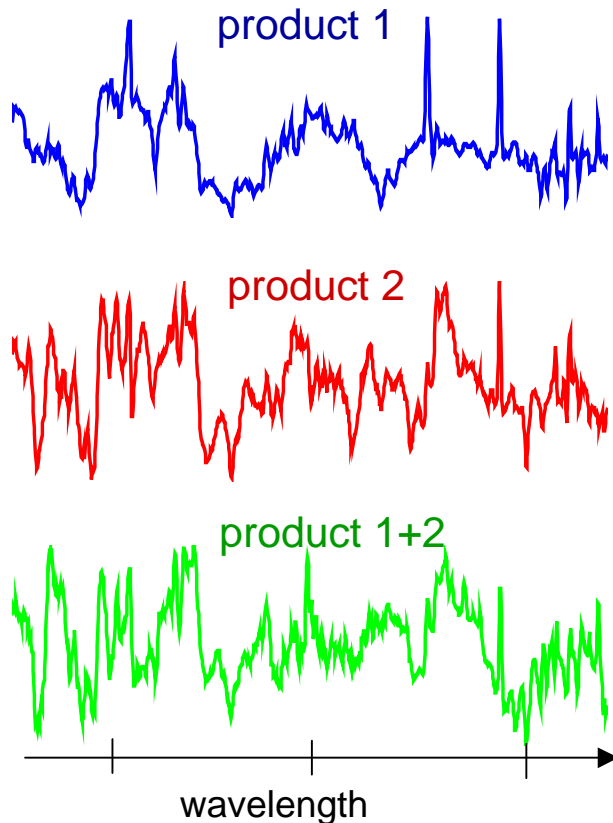


essence: variation of  $\theta$  permits to adjust compromise between sensitivity and robustness of the endpoint signal

# Application to Production Data

→ product robustness

designed pattern using  
spectral data from:



- in order to cope with spectral variations caused by different products (processed with the same recipe) it is useful to incorporate spectral data from several etches

- all influences incorporated in the data will be considered during the modeling process in order to prevent variations and drifts in resulting EP-signal

# Application to Production Data

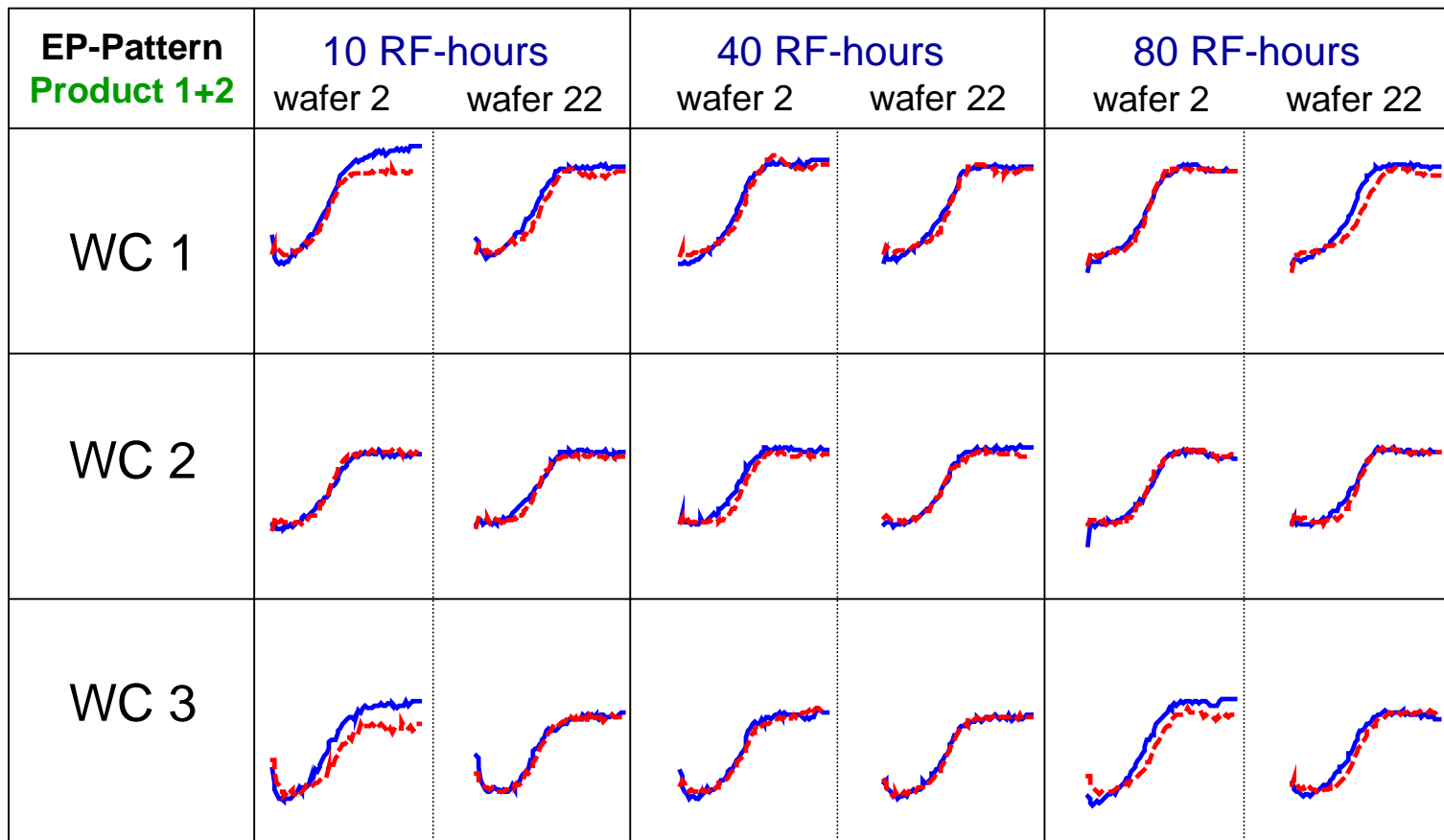
→ product robustness



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-- product 1  
-- product 2

➔ the assessment of several etches during the modeling yields to long term and product robust EP-signals

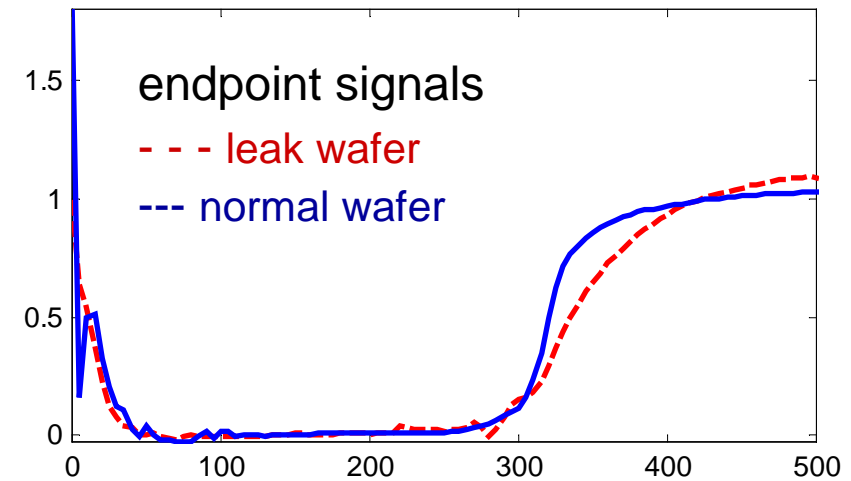
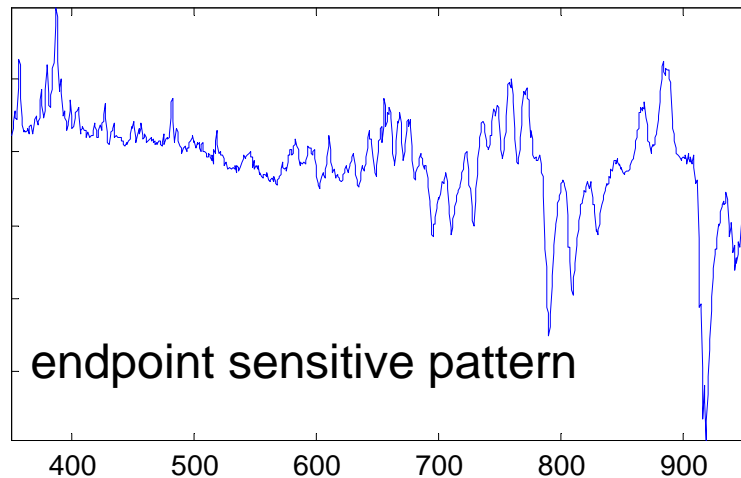
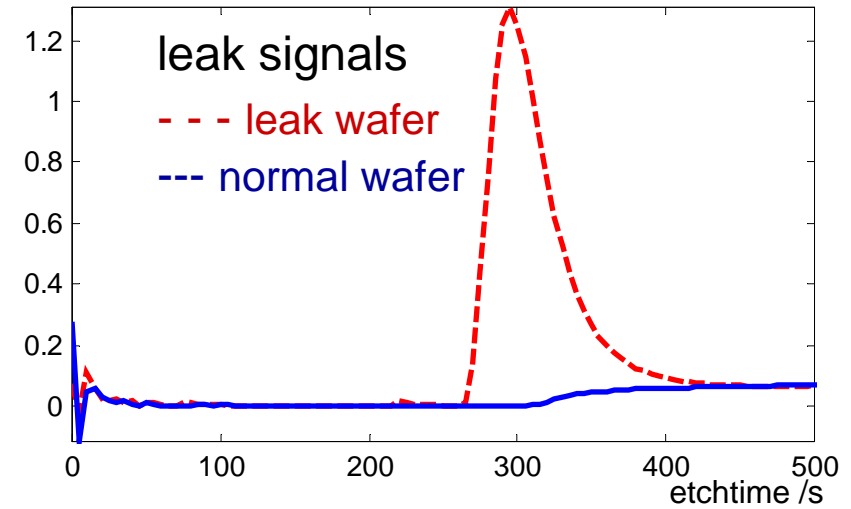
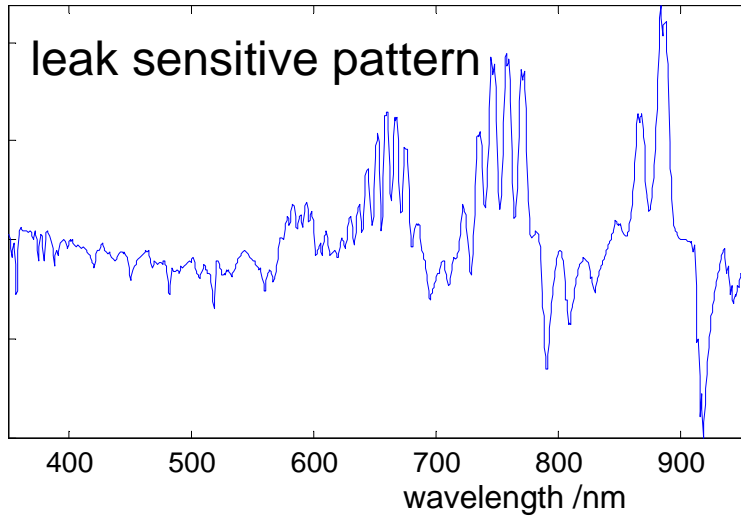


# Application to Production Data

→ pattern based separation of influences



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# Summary

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- a model based approach for designing endpoint specific wave pattern was shown
- easy and fast on-line calculation of an endpoint signal is possibly by a simple multiplication of the endpoint pattern with the measured spectra
- short and long term variations like chamber pollution, conditioning, product influences etc. are taken into account, using spectral data from more than one process for endpoint pattern design
- the sensitivity parameter  $\theta$  allows a convenient adjustment of the sensitivity / robustness compromise

