
Using Multi Way PCA (MPCA) for Advanced Monitoring and Diagnosis for Plasma Processing based on Optical Emission Spectroscopy

Jan Zimpel

Knut Voigtländer

Fraunhofer IVI Dresden

Andreas Steinbach

Infineon Technologies Dresden

Dirk Knobloch

Infineon Technologies München

Jan Zimpel
Knut Voigtländer
Fraunhofer Institut
IVI Dresden

Andreas Steinbach
Infineon Dresden

Dirk Knobloch
Infineon München



Acknowledgement

The authors of this presentation
would like to thank

Siegfried Bernhard

Lars Christoph

Barbara Schmidt

Infineon Technologies Dresden

Jan Zimpel
Knut Voigtländer
Fraunhofer Institut
IVI Dresden

Andreas Steinbach
Infineon Dresden

Dirk Knobloch
Infineon München



Outline

- Introduction - APC in high volume production
- Hardware integration and software structure
- Data reduction by PCA
- Experiments
 - Contact etch at AMAT MxP+
 - Poly etch at AMAT DPS
- Summary and outlook

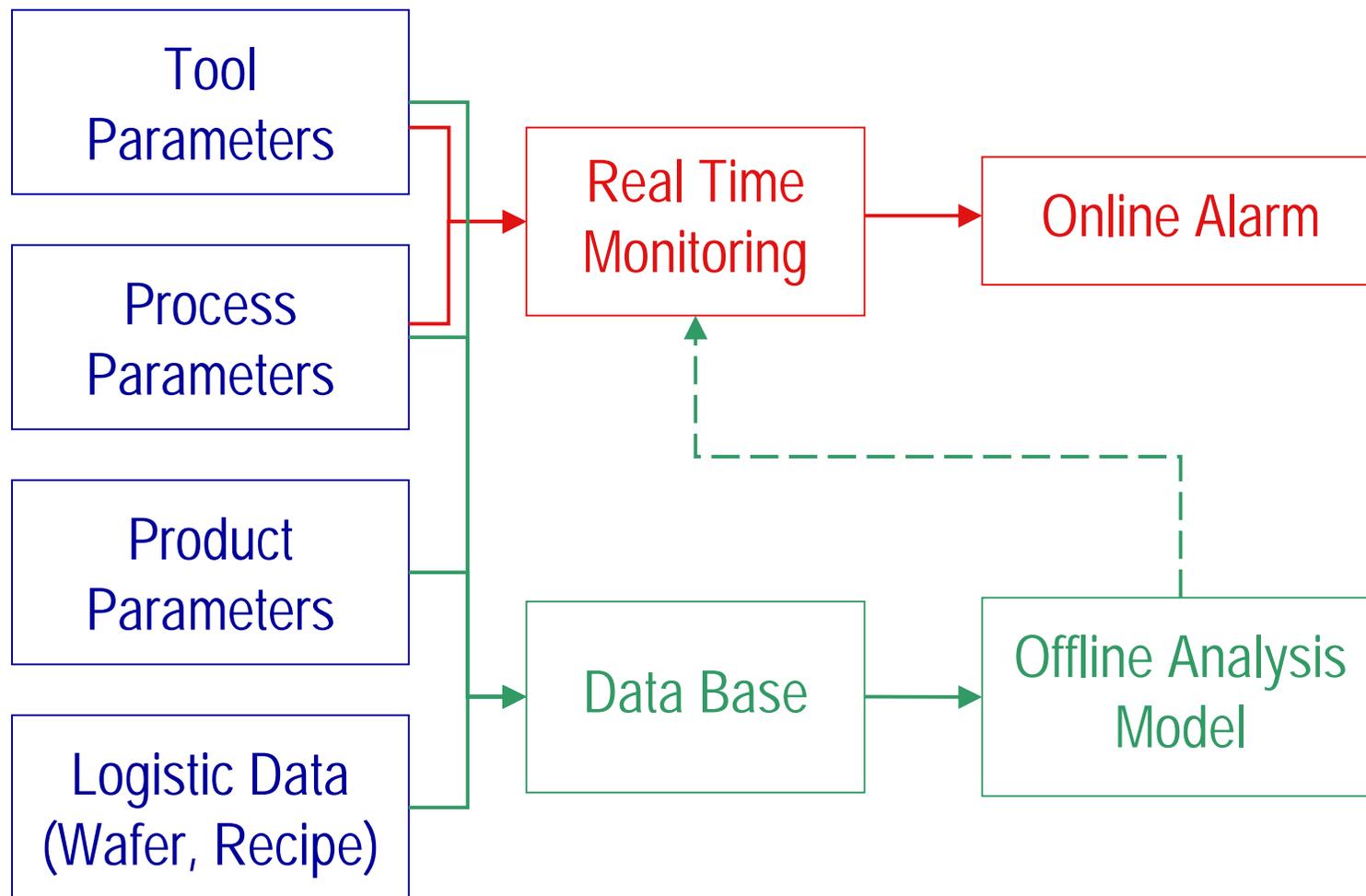
Jan Zimpel
Knut Voigtländer
Fraunhofer Institut
IVI Dresden

Andreas Steinbach
Infineon Dresden

Dirk Knobloch
Infineon München



APC - offline analysis and real time process control including alarms



Jan Zimpel
Knut Voigtländer
Fraunhofer Institut
IVI Dresden

Andreas Steinbach
Infineon Dresden

Dirk Knobloch
Infineon München



Data reduction – an essential need for APC in high volume production

- APC in high volume production creates large amounts of data
- Data reduction is an essential need for off line analysis and real time process monitoring
- Methods for data reduction:
 - Measurement techniques based on physical models
 - Calculation of statistical key numbers
 - Use of complex process parameters
 - Model based data analysis

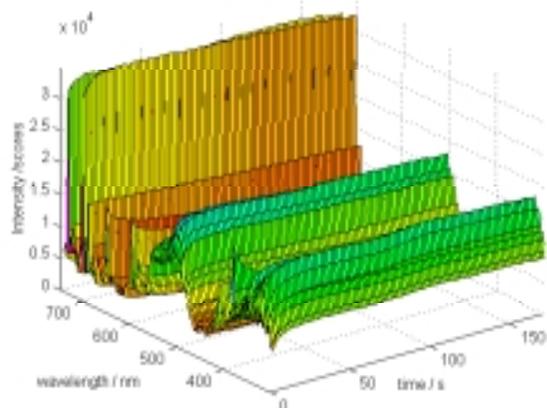
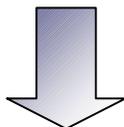
Jan Zimpel
Knut Voigtländer
Fraunhofer Institut
IVI Dresden

Andreas Steinbach
Infineon Dresden

Dirk Knobloch
Infineon München

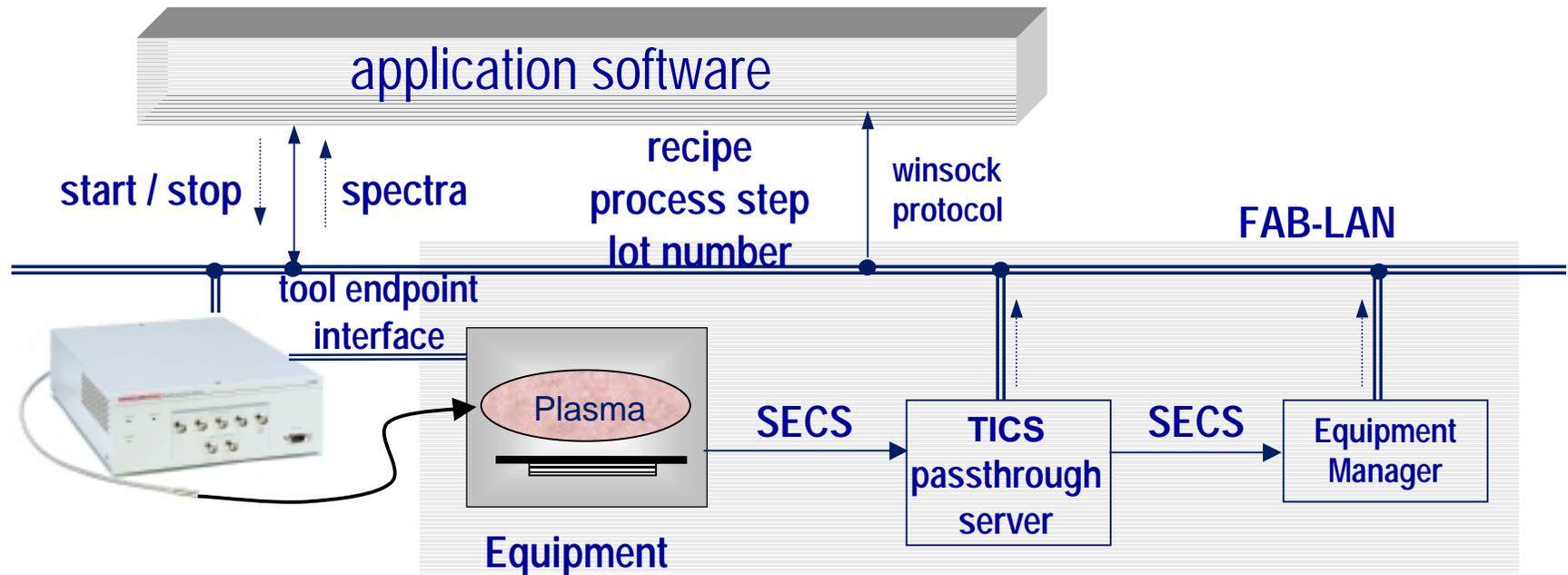


Features of Hamamatsu MPM spectrometer



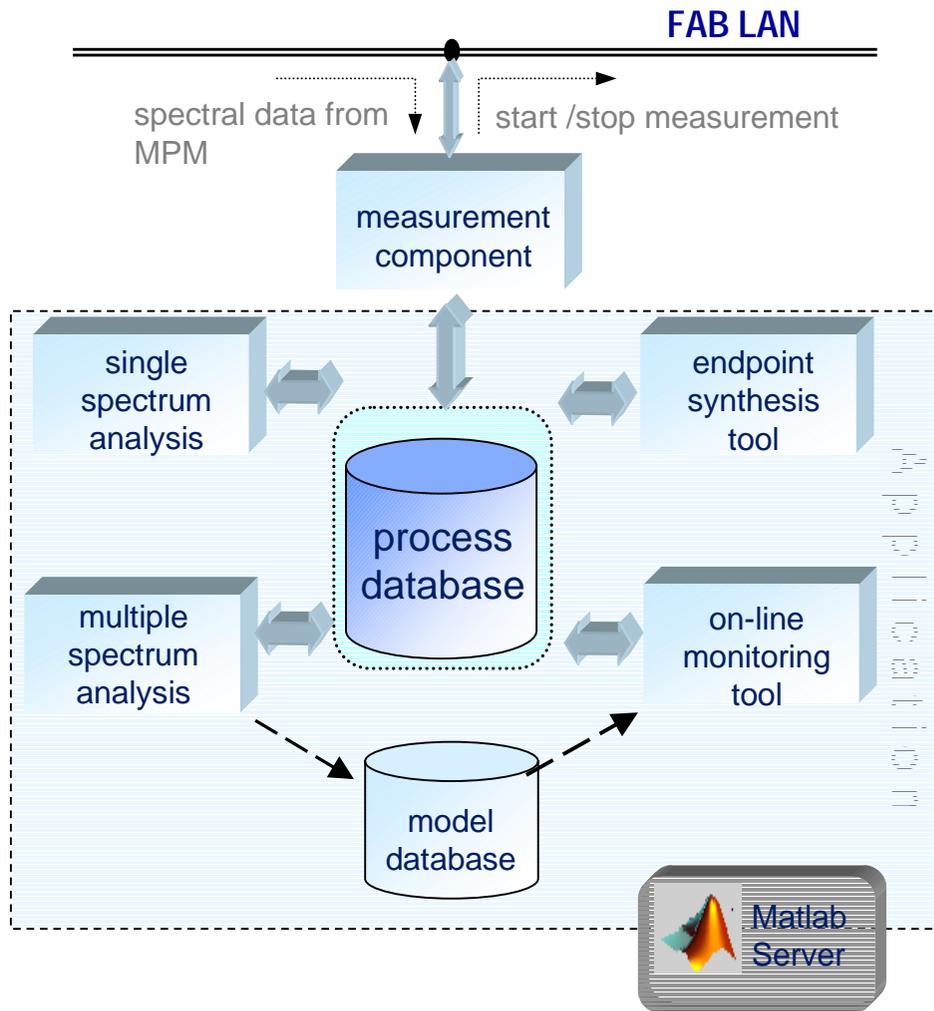
- Spectral range: 200 - 950 nm
- Resolution: < 2 nm
- CCD line channels: 1024
- Connection to Host PC via TCP-IP, RS 232
- Internal data processing for endpoint detection; up to 100 endpoint scrip's are available
- Digital / analog port's for connection to tool

Integration of Hamamatsu MPM spectrometer



- Tool interface for stand alone endpoint detection
- Interface for logistic data
e.g., lot and wafer number, recipe, step number

Software solution developed by Fraunhofer Institut IVI Dresden



- Database oriented spectra storage and SQL- based data access for:

- Data visualization
- Data analysis
- Endpoint synthesis
- Validation of endpoint detection algorithms

Jan Zimpel
Knut Voigtländer
Fraunhofer Institut
IVI Dresden

Andreas Steinbach
Infineon Dresden

Dirk Knobloch
Infineon München



Data reduction by key number calculation with PCA

- Simple key number extraction:
mean, standard deviation, max, min, ...
- Extraction of key numbers using signal decomposition:
 - Tschebyscheff functions
 - Adjusted signal base (PCA)
Multivariate key number extraction -- Multi Way PCA
- Adaptation of a nonlinear parametric signal model
- Compromise between efficiency and effort / a-priori knowledge

Jan Zimpel
Knut Voigtländer
Fraunhofer Institut
IVI Dresden

Andreas Steinbach
Infineon Dresden

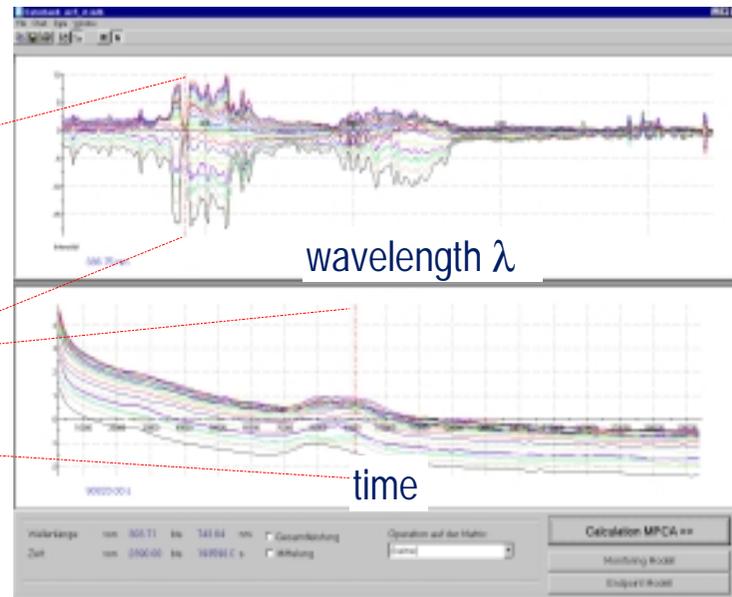
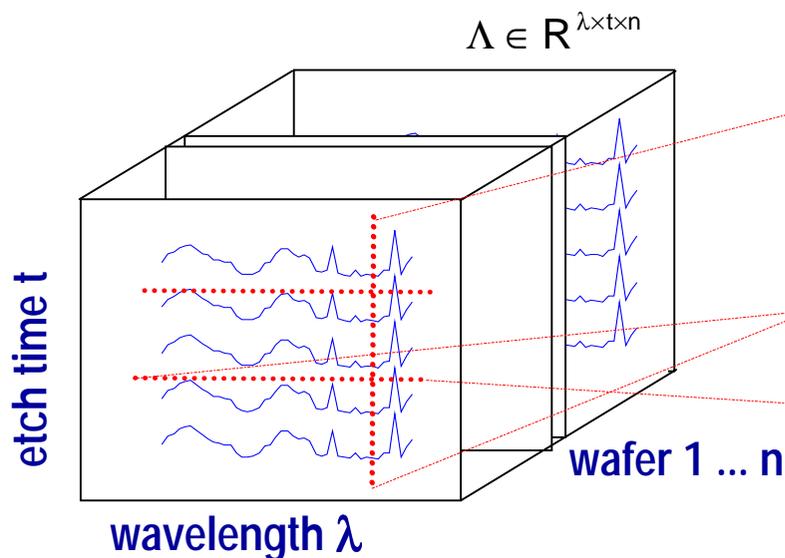
Dirk Knobloch
Infineon München



Principle of PCA – Data cube

Data cube containing spectra

Vertical and horizontal cut through Data cube



- Optical spectra visualized as a „Data cube“
- Optical emission spectroscopy creates very large amounts of data !

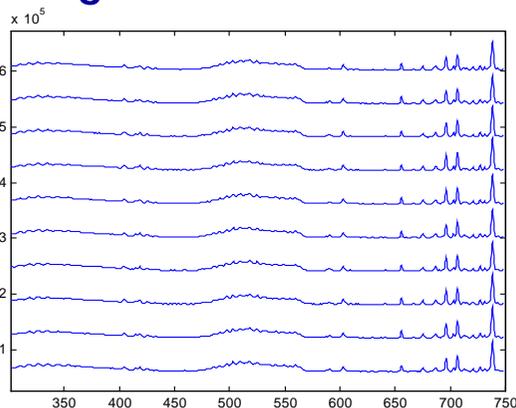
Principle of PCA – Matrix calculation

- Split of the original data matrix into orthogonal pattern u_i and orthogonal scores m_i :

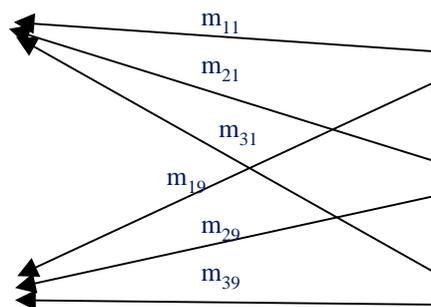
$$X = M \cdot U^T = \sum_i m_i \cdot \underline{u}_i^T$$

- Scores represent the weight of the corresponding pattern in the original data sample

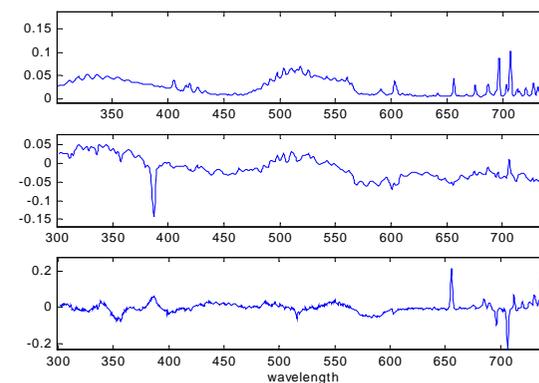
original data: X



scores: m_i



base pattern: u_i



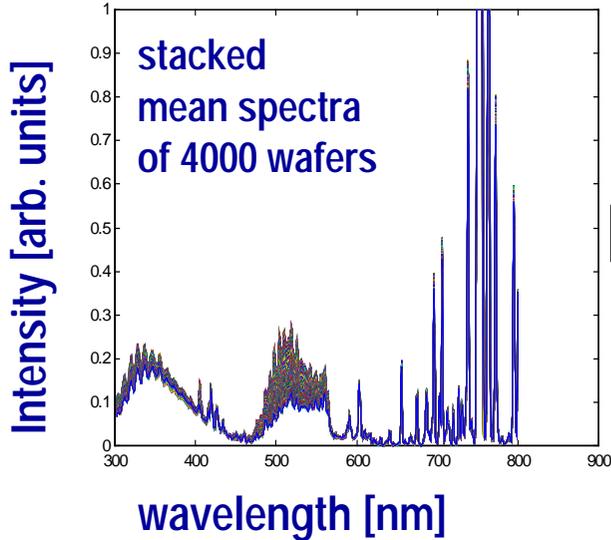
Application of PCA on DRAM contact etch at Applied Materials MXP+ chamber

- Contact etch at Applied Materials MxP+ chamber
- Standard oxide etch chemistry, CF_4 , CHF_3 , Ar
- Observation of 5 wet clean cycles (WC), about 4000 wafers
- Simple process mix, two different recipes for two high volume DRAM products mainly

Step	Product 1	Product 2
Descum	--	N_2 / O_2 descum
Main etch 1	BPSG etch	BPSG etch
Main etch 2	--	Nitride etch

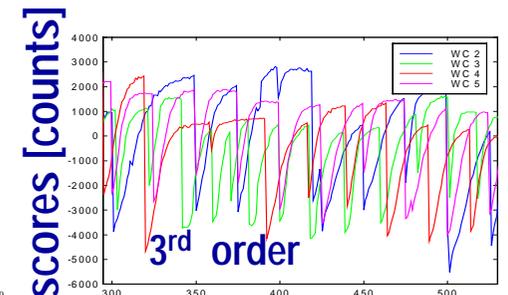
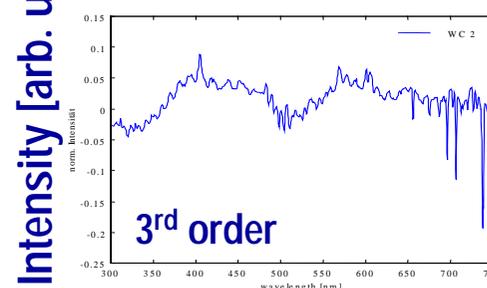
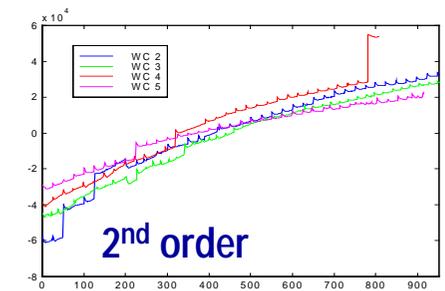
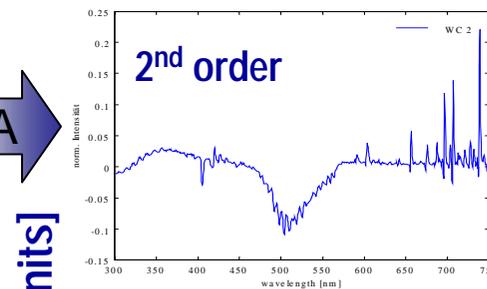
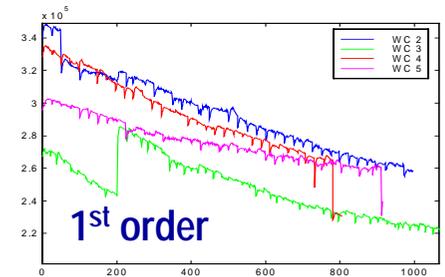
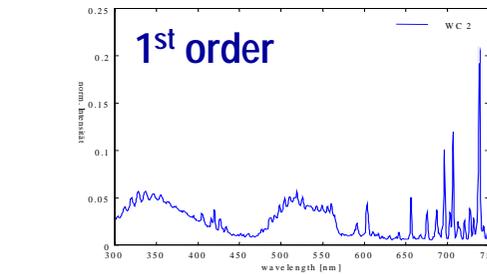
PCA results obtained on DRAM contact etch at Applied Materials MXP+ chamber

Matrix X: mean spectra of 4000 wafers of 5 wet clean cycles (WC)



PCA

Patterns and scores 1st to 3rd order of WC 2 .. 5

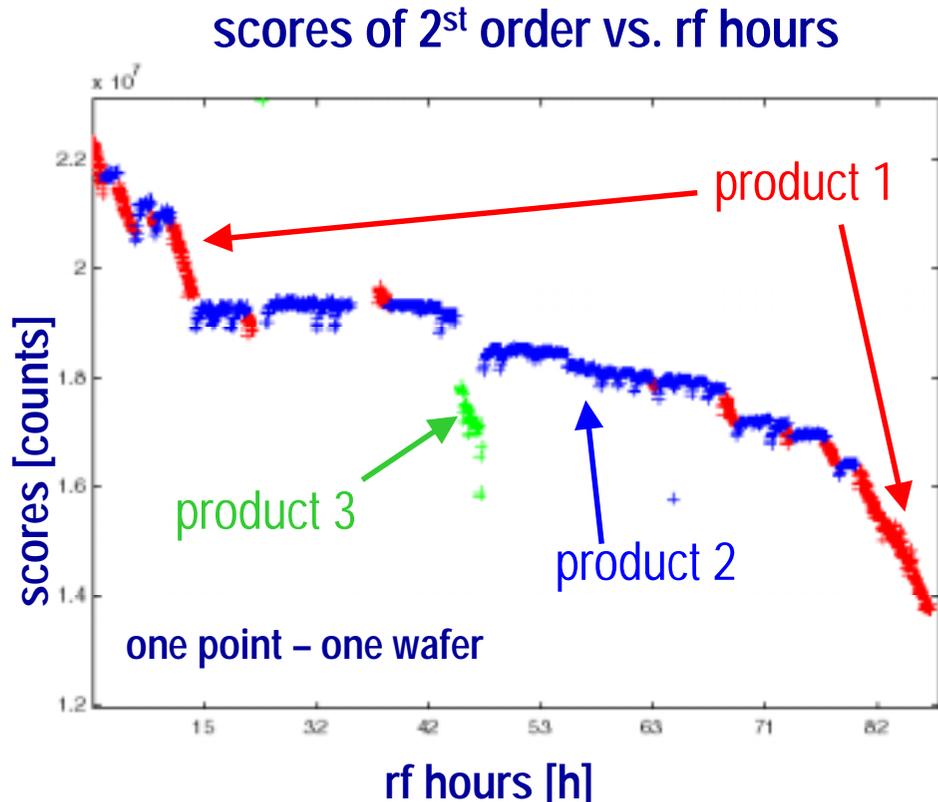


Jan Zimpel
Knut Voigtländer
Fraunhofer Institut
IVI Dresden
Andreas Steinbach
Infineon Dresden
Dirk Knobloch
Infineon München



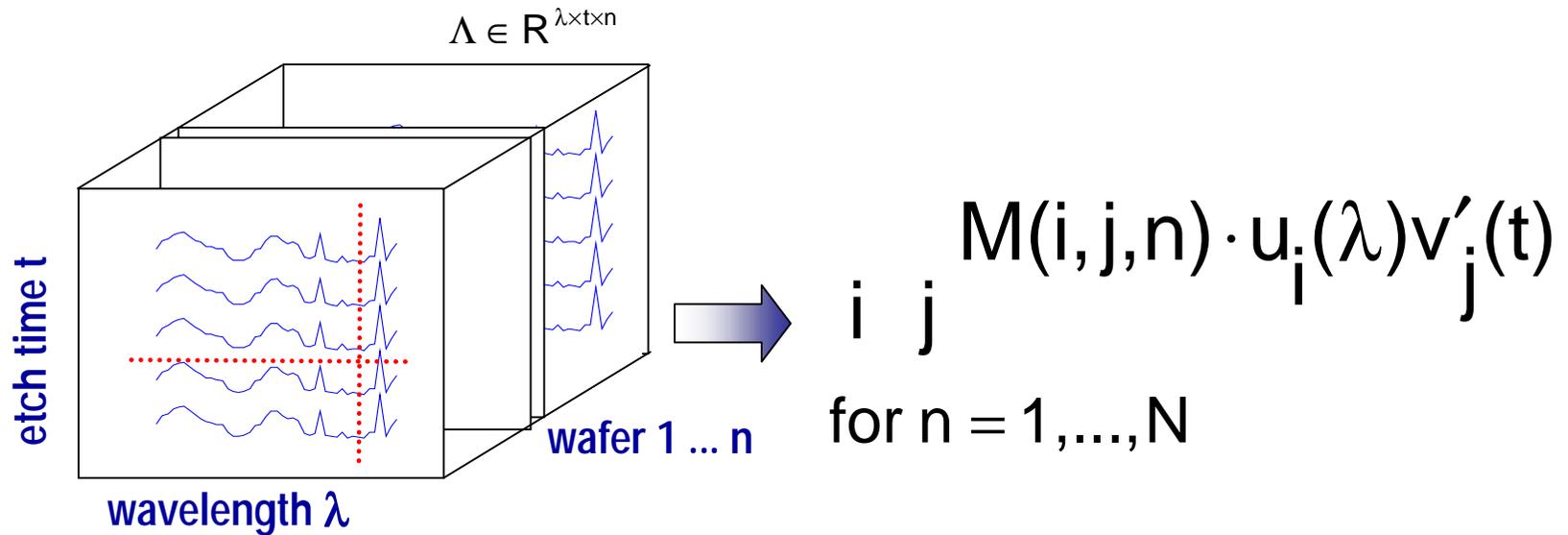
PCA results obtained on contact etch at Applied Materials MXP+ chamber, cont.

- CF_4 , CHF_3 , Ar chemistry, two main DRAM products
- Scores of 2st order of the first observed at wet clean cycle 1



- Product 1: high polymerizing
- Product 2: low polymerizing
- Scores of 2st order decrease during WC1, caused by:
 - Increasing light absorption at polymer layer on the recess side window
 - And real process drift caused by polymer on chamber wall
- Product dependent monitoring of chamber condition

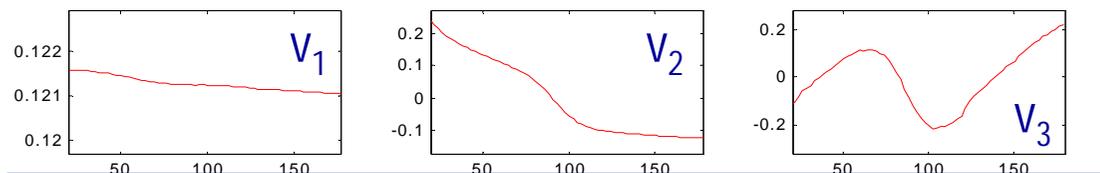
Multi-Way Principle Component Analysis



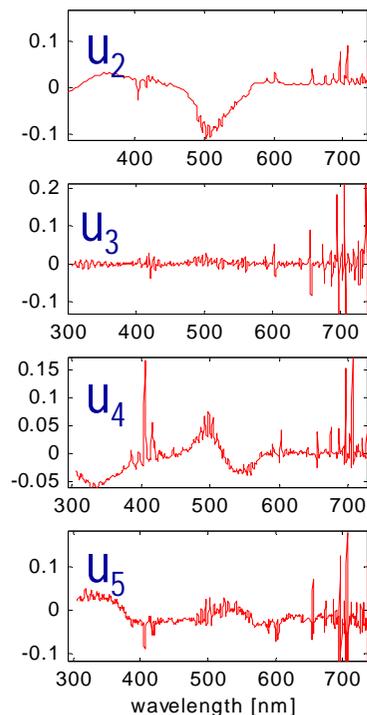
- "One way PCA": use of one mean spectrum per wafer
- Multi Way PCA: Calculation of orthogonal wave pattern u_i and orthogonal base time signals v_i by unfolding the original data cube in time and wave direction

Some examples of key numbers obtained by Multi Way PCA on contact etch at AMAT MxP+

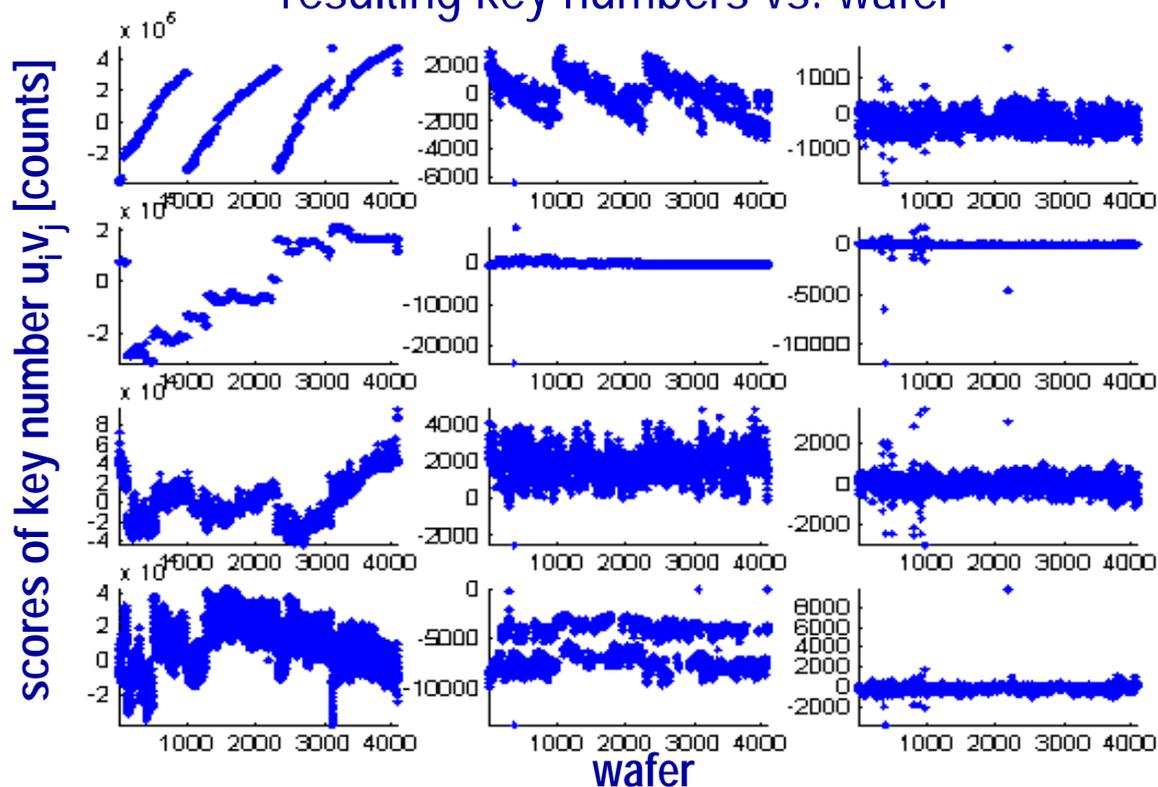
extracted
basic time signals v_j



extracted basic wave pattern u_j



resulting key numbers vs. wafer



Jan Zimpel
Knut Voigtländer
Fraunhofer Institut
IVI Dresden
Andreas Steinbach
Infineon Dresden
Dirk Knobloch
Infineon München



Interpretation of key numbers $u_i; v_j$

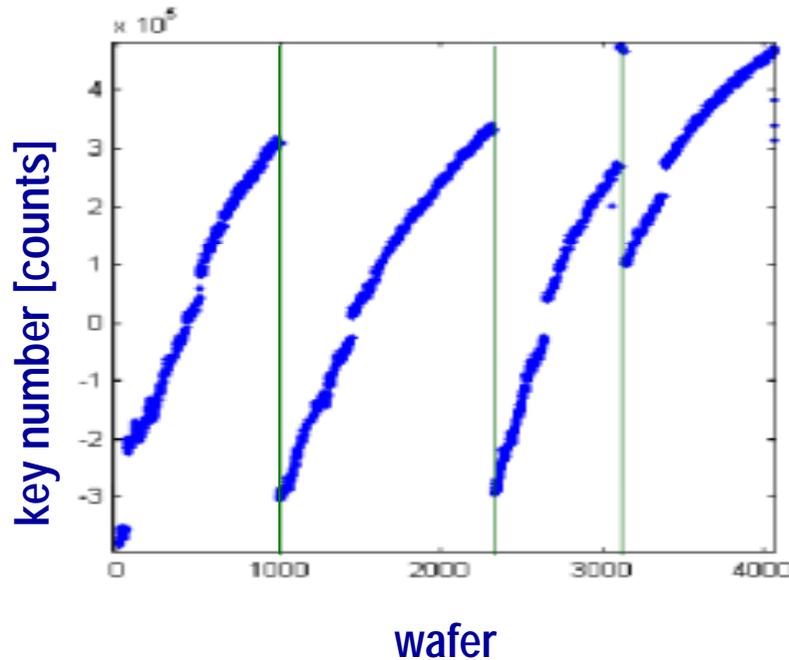
- Significant signatures up to 10th...20th order of u_i and v_j , max. about 100...400 key numbers
- Significant key numbers limited by:
 - increasing order
 - decreasing information content
 - redundant signatures

- PCA = mathematical algorithm, no physical or technological input
- Advantage: universal, application to any kind of data possible
- Disadvantage: no clear physical meaning of these key numbers
- Difficult interpretation

- Interpretation of key numbers with help of:
 - Physical, chemical, technological knowledge
 - Comparison to other measurement techniques, delivering physical parameters

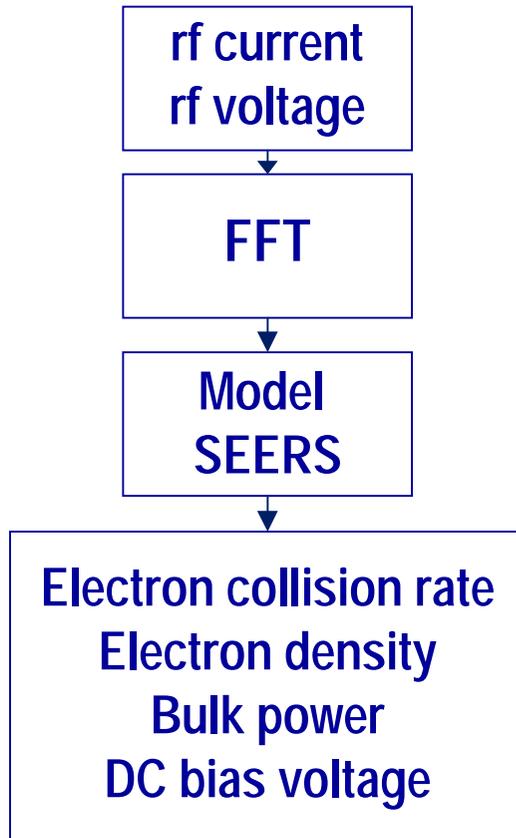
Interpretation of optical key numbers with experience

key number $u_2:v_1$ vs. wafer



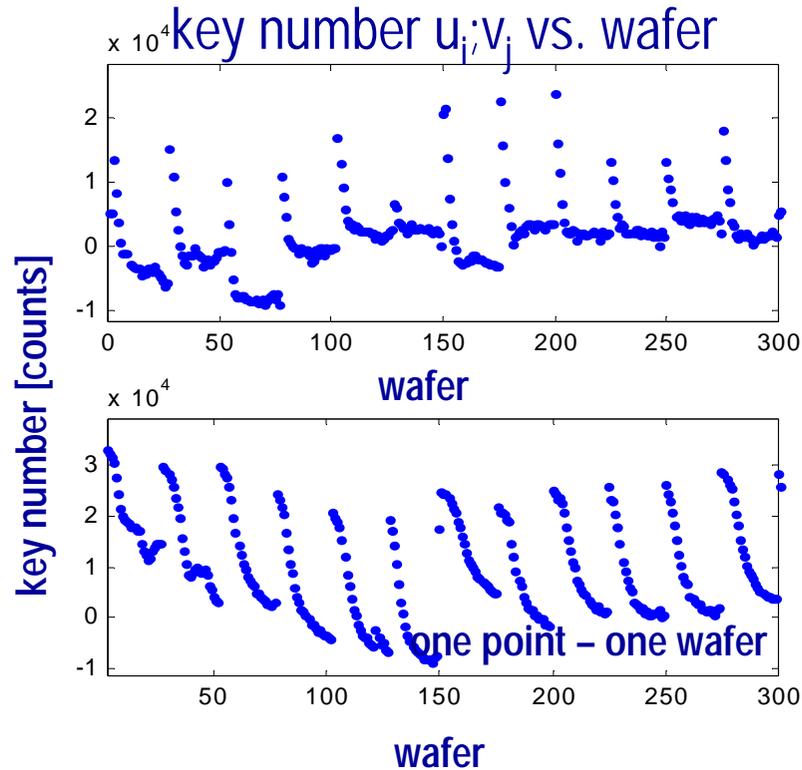
- Key number $u_2:v_1$ shows reproducible long term drift between wet cleans.
- Experience possible reasons:
 - Light adsorption by polymer, growing on recess side window
 - Drift of gas composition, caused by polymer on the chamber walls
- No influence of power dissipation here

Reference: Plasma parameter measurement with SEERS



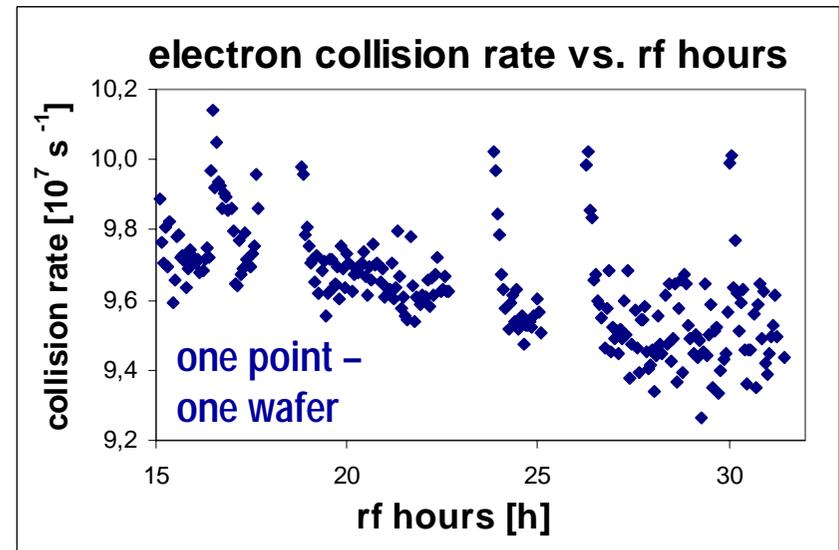
- SEERS = Self Excited Electron Plasma Resonance Spectroscopy
= „electrical“ plasma measurement technique
- Measurement of:
 - rf current
 - rf voltage
- Real time calculation of plasma parameters:
 - Electron collision rate [collisions per sec]
 - Electron density [electrons per cm³]
 - Bulk power [mW per cm²]
 - DC bias voltage [V]
- Plasma monitoring system HERCULES, based on SEERS was used as reference system

Interpretation of optical key numbers with comparison to plasma parameters

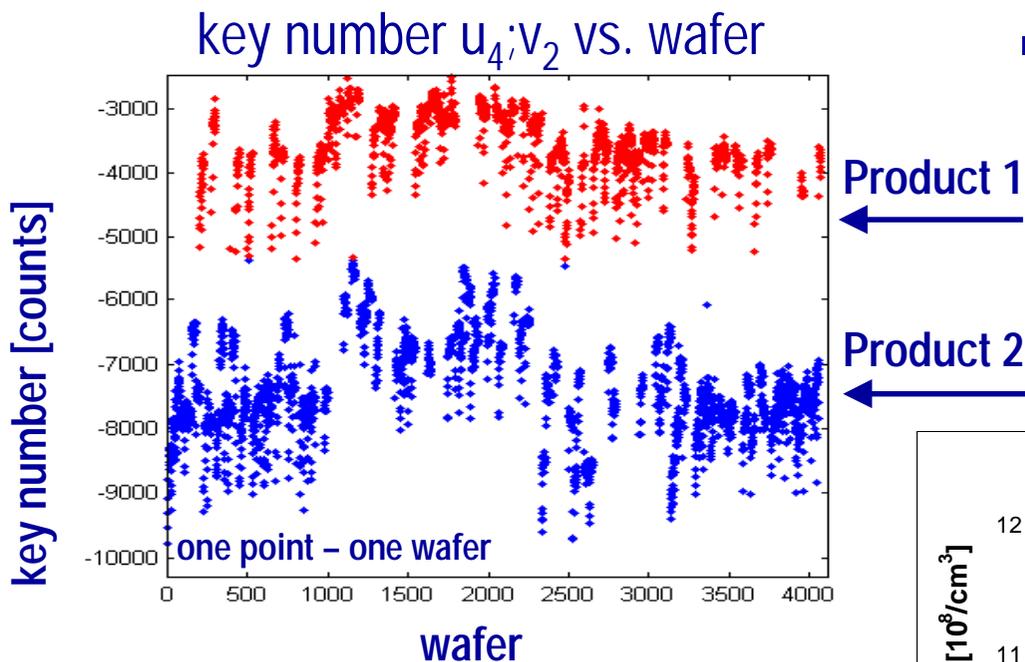


- Possible reasons:
 - Temperature drift
 - Gas adsorption and desorption

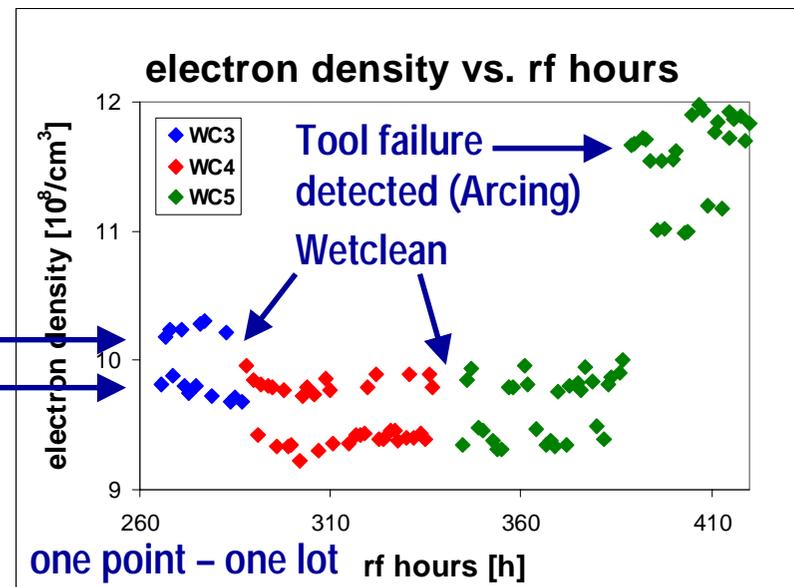
- Short term drift indicated by:
 - Optical key numbers, e.g., $u_4; v_1$, $u_5; v_1$
 - Electron collision rate



Interpretation of optical key numbers with comparison to plasma parameters, cont.



- Product indicated by:
 - Optical key number $u_4:v_2$ (no optical measurements available during the tool failure)
 - Electron density



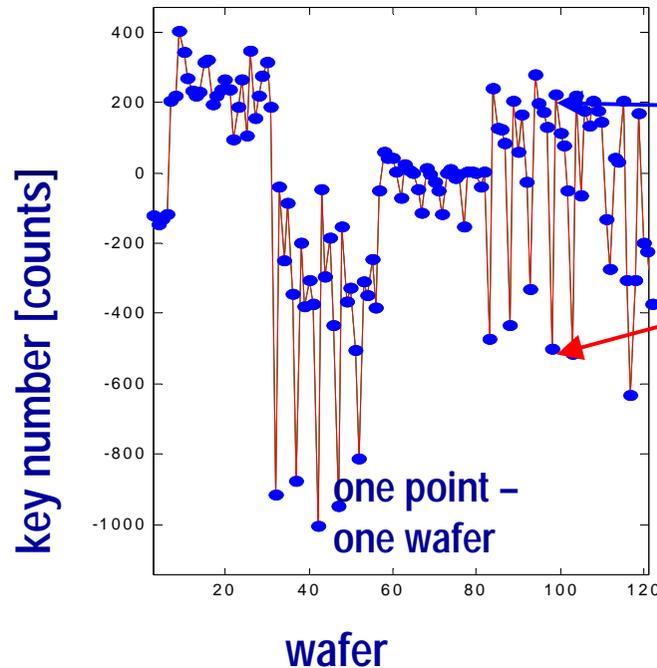
- Reason:
 - Different open area of 2 products

Jan Zimpel
 Knut Voigtländer
 Fraunhofer Institut
 IVI Dresden
 Andreas Steinbach
 Infineon Dresden
 Dirk Knobloch
 Infineon München

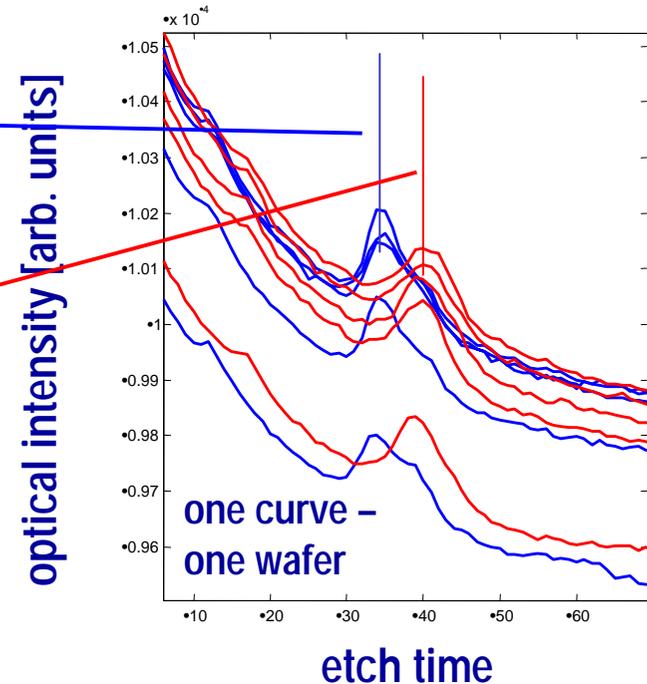


Interpretation of optical key numbers with comparison to endpoint signatures

key number $u_5; v_6$ vs. wafer



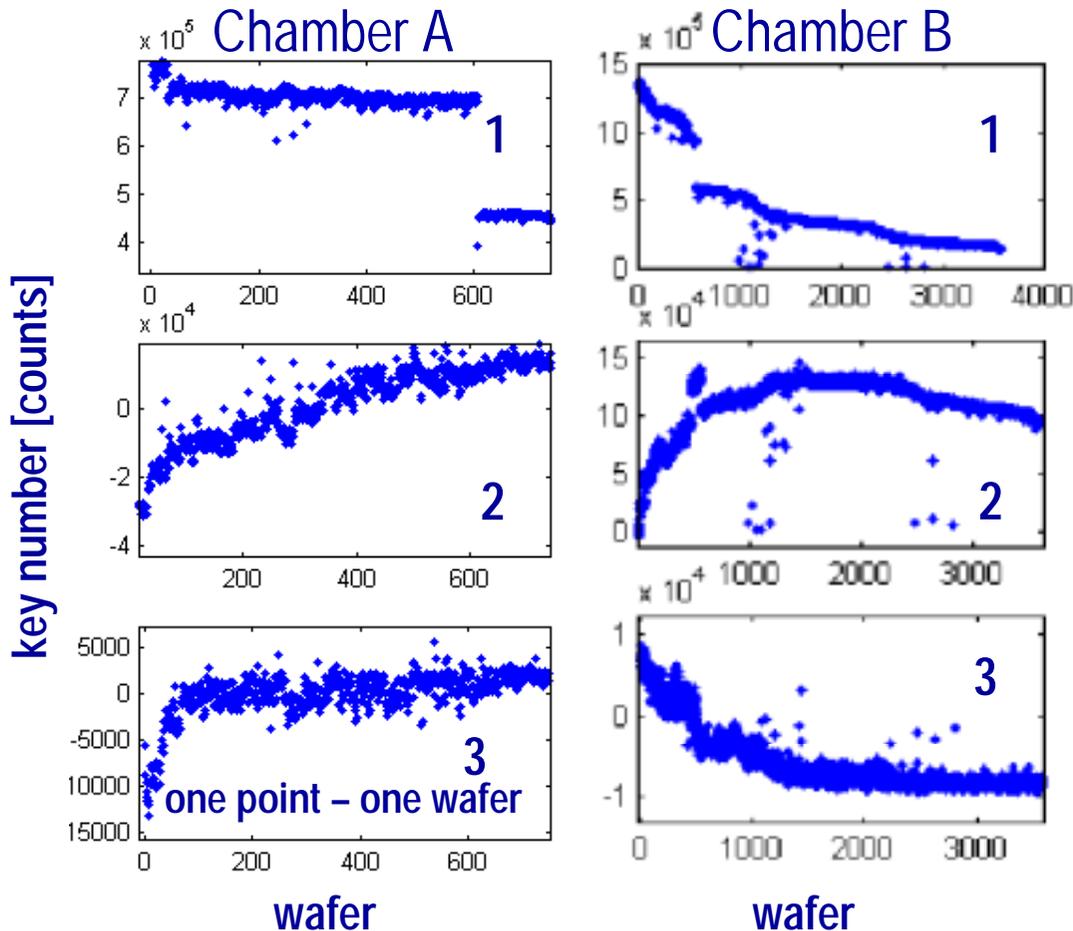
optical endpoint signal vs. etch time



- Key number $u_5; v_6$ corresponds with endpoint time
- Superimposition of previous processes, depending on lot

Topical Example: Chamber comparison at poly recess etch in Applied Materials DPS

key numbers vs. wafer



- Measurement at chamber B several weeks later.
- Key numbers indicate other conditions at chamber B (see 3).
- Reasons not yet identified.

Jan Zimpel
 Knut Voigtländer
 Fraunhofer Institut
 IVI Dresden
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 Infineon Dresden
 Dirk Knobloch
 Infineon München



Summary and outlook

- PCA / MPCA is a universal mathematical method for data analysis and data reduction.
- Key numbers obtained by application of PCA / MPCA on optical spectra are complex process parameters, indicating tool and wafer impacts.
- Interpretation of key numbers is possible by use of:
 - extracted spectral wave pattern and basic time signals
 - physical, chemical, technological knowledge
 - comparison to other process parameters and tool parameters
- Actual evaluation / application status:
 - Endpoint detection demonstrated at contact etch processes
 - Application for optimization of endpoint signals and clean processes
- Use for real time process control in high volume production is a great challenge, due to large number of key numbers and complex interpretation.

