

REFLECTANCE-BASED SURFACE SALIENCY

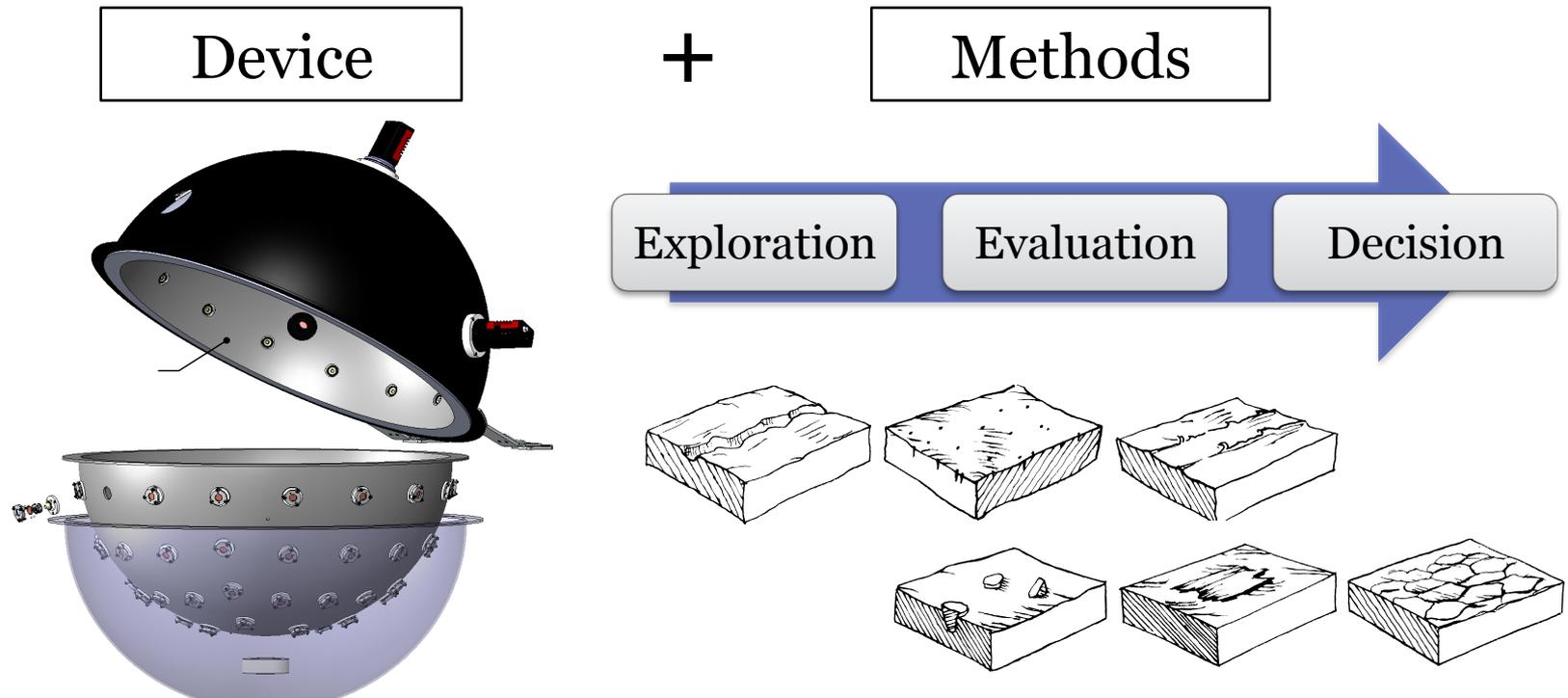
Gilles Pitard, Gaëtan Le Goïc, Alamin Mansouri, Hugues Favrelière,
Maurice Pillet, Sony George, and Jon Yngve Hardeberg



The Norwegian
Colour and Visual Computing
Laboratory

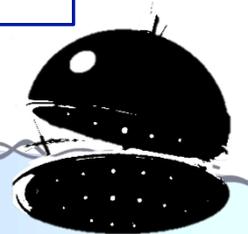


Scope and Objectives



Main aim

→ Develop an automatic inspection vision system to measure the quality of industrial products



Enlarging the scope to other applications

➔ Detect and quantify the salient features (such as changes and degradations) on the cultural heritage objects using new imaging modalities

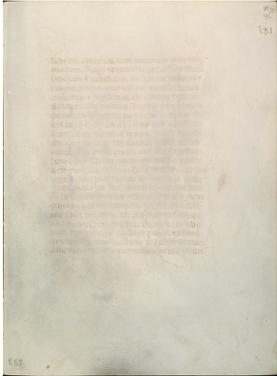
Wall paintings



Fossils



Palimpsests

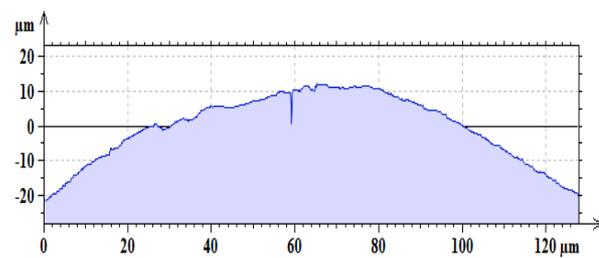


3 ways to address this challenge Measuring, modeling and controlling:

①

Geometry

Altitudes, normals, and curvatures



②

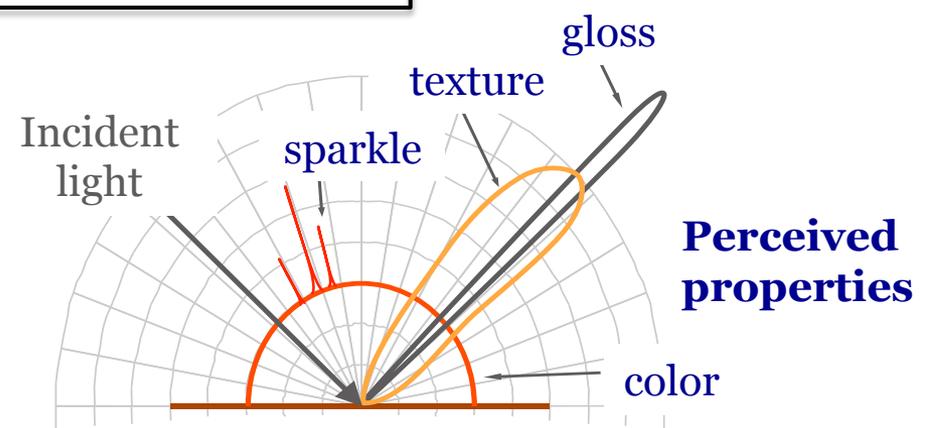
Spatial BRDF

Angular distribution of the reflected light

③

Spectral BRDF

Wavelengths



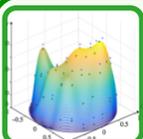
B.R.D.F : Bidirectionnall Reflectance Distribution Function





1. Reflectance Transformation Imaging

- ⊕ Related works
- ⊕ RTI Devices



2. Modeling the angular reflectance

- ⊕ Angular reflectance modeling
- ⊕ Discrete Modal Decomposition



3. Computing the saliency maps

- ⊕ Rotation-invariant representation
- ⊕ Multivariate analysis



4. Conclusion



1. REFLECTANCE TRANSFORMATION IMAGING

Approaches for BRDF assessment

Methods	Principle	Advantages/ disadvantages
Measuring the BRDF	measures using a goniospectrophotometer	<p>😊 complete characterization of an infinitesimal area element of the surface</p> <p>☹ total amount of data</p> <p>☹ data acquisition time</p>
Model-based rendering	analytical BRDF Models, eg. Phong, Cook-Torrance,...	☹ not suitable for the rendering of real-world surfaces
Image-based rendering	reflectance estimated from photometric stereo data	<p>😊 rapid acquisition</p> <p>😊 not require knowledges of physical and geometrical properties</p>

Measuring the BRDF

measures using a goniospectrophotometer

😊 complete characterization of an infinitesimal area element of the surface

☹ total amount of data
☹ data acquisition time

Model-based rendering

analytical BRDF Models, eg. Phong, Cook-Torrance,...

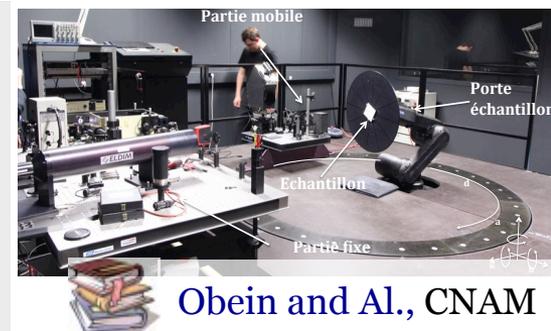
☹ not suitable for the rendering of real-world surfaces

Image-based rendering

reflectance estimated from photometric stereo data

😊 rapid acquisition
😊 not require knowledges of physical and geometrical properties

→ e.g. Reflectance Transformation Imaging



Obein and Al., CNAM

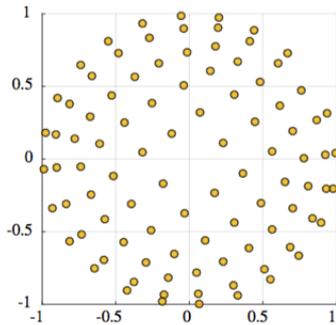


1. REFLECTANCE TRANSFORMATION IMAGING

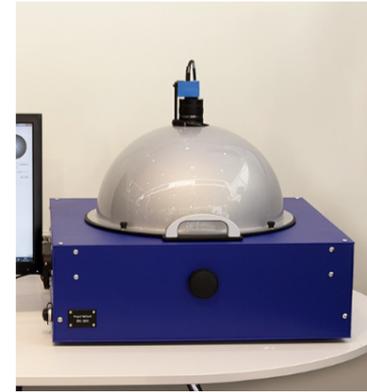
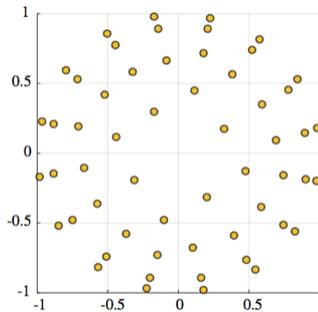
RTI devices → photometric stereo acquisition



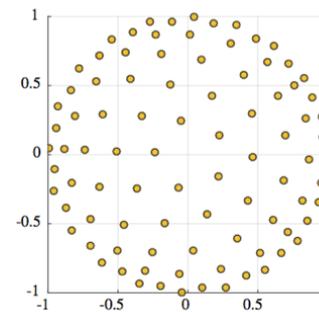
Dome v.1
 ∅ 900mm
 1 digital camera
 96 light sources



MeSurA Sphere
 ∅ 650mm
 4 cameras
 112 light sources



Dome Opto
 ∅ 320mm
 1 camera
 90 light sources

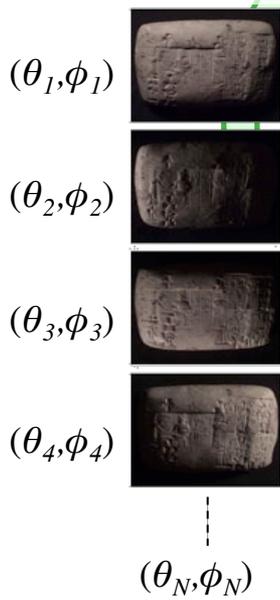


1. REFLECTANCE TRANSFORMATION IMAGING

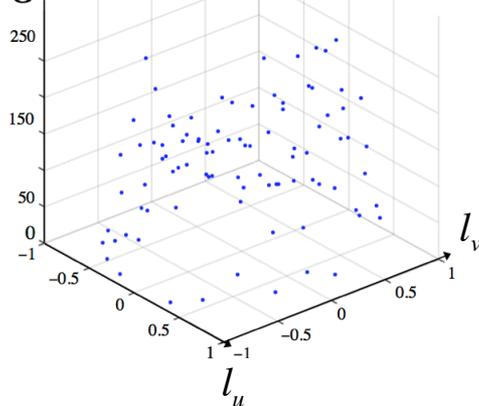
PTM Polynomial Texture Mapping

1 – Acquisition

Set of N images

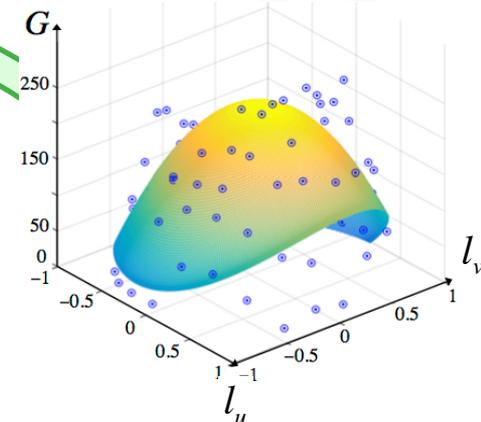


For each pixel:
 N values of luminance



2 – Modeling

6 polynomial coefficients
noted a_0 to a_5



$$L(l_u, l_v) = a_0 + a_1 l_u + a_2 l_v + a_3 l_u l_v + a_4 l_u^2 + a_5 l_v^2$$

3 – Rendering

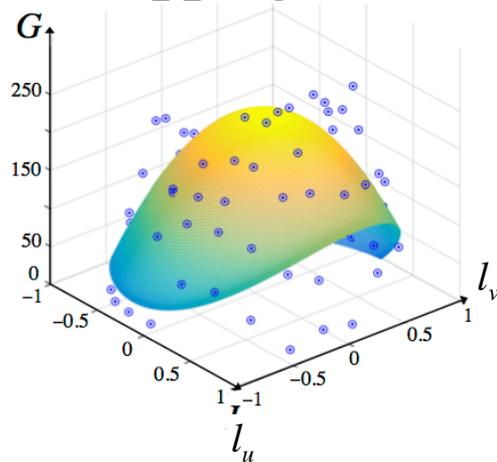
Interpolate and re-lighting the object under a new lighting direction chosen by the user



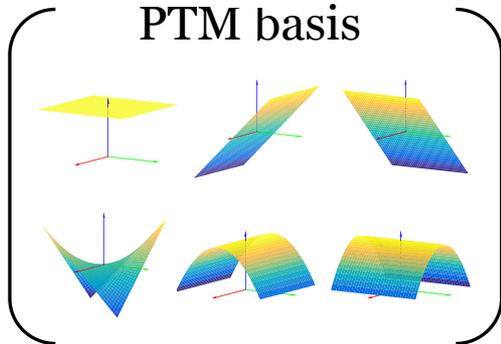
1. REFLECTANCE TRANSFORMATION IMAGING

Existing models

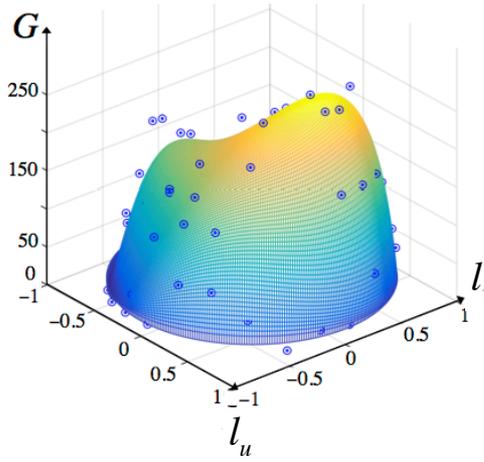
Polynomial Texture Mapping **PTM**



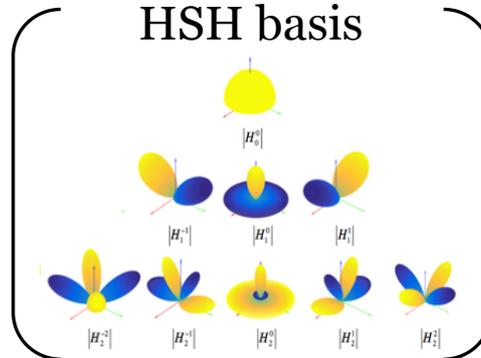
PTM basis



Hemispherical Harmonics **HSH**

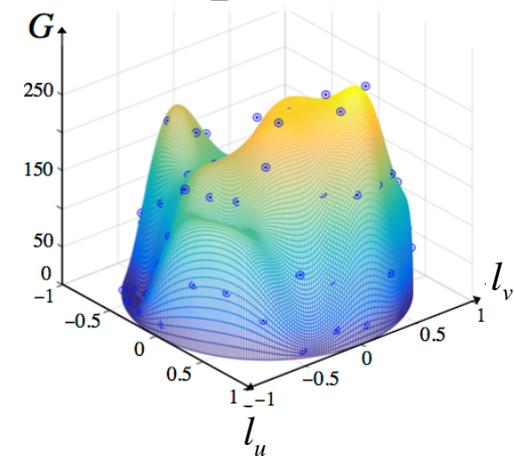


HSH basis

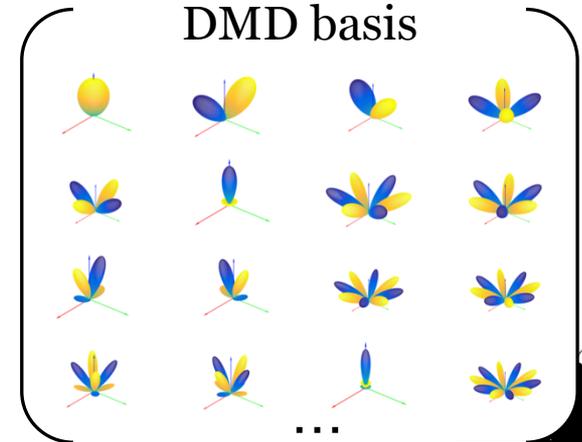


Proposed model

Discrete Modal Decomposition **DMD**



DMD basis

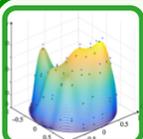


GILLES PITARD, et al. “Discrete Modal Décomposition: ...”.
Machine Visions and Applications, 2017



1. Reflectance Transformation Imaging

- ⊕ Related works
- ⊕ RTI Devices



2. Modeling the angular reflectance

- ⊕ Angular reflectance modeling
- ⊕ Discrete Modal Decomposition



3. Computing the saliency maps

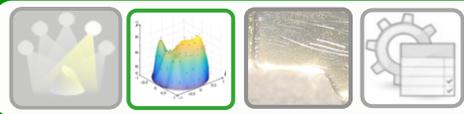
- ⊕ Rotation-invariant representation
- ⊕ Multivariate analysis

→ Proposal for a new R.T.I method,



4. Or called « Discrete Modal Decomposition »

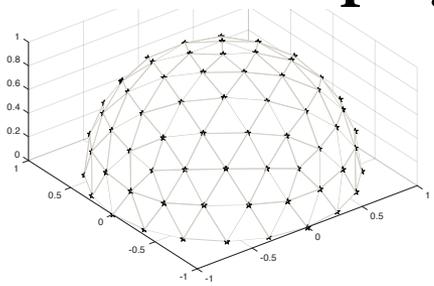




2. MODELING THE ANGULAR REFLECTANCE

↘ Basis of projection called « Reflectance Modal Basis »

Discretization of the nominal surface geometry



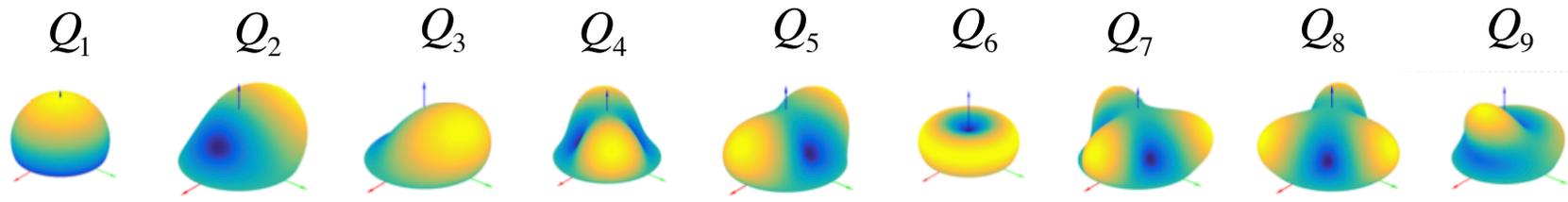
Classical equations of motion

$$M.\ddot{q} + K.q = 0 \quad \text{avec} \quad q = q(\theta, \phi, t)$$

$$q(\theta, \phi, t) = \sum_{k=1}^{+\infty} Q_k \cos(w_k t)$$

$$(M^{-1}K - \frac{1}{w_k^2} I) Q_k = 0$$

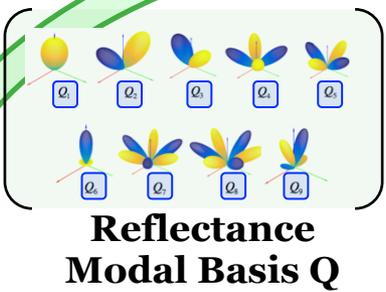
Calculation of modes Q_k with the pulsation w_k



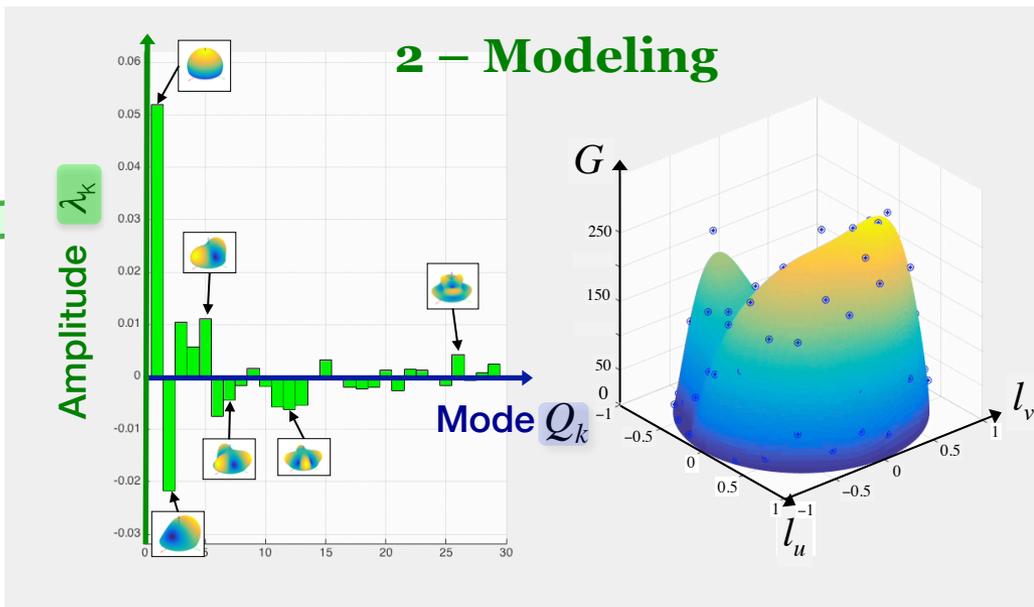
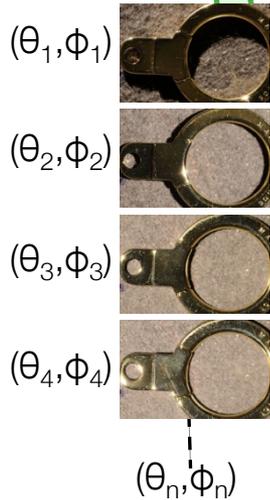
2. MODELING THE ANGULAR REFLECTANCE

For each pixel:

λ_k modal coefficients obtained by projecting the measured luminances L onto each mode Q_k of the basis



1 - Acquisition



$$f_{(\theta_v, \phi_v)}(\theta_i, \phi_i) = \sum_{k=1}^n \lambda_k(\theta_v, \phi_v) Q_k(\theta_i, \phi_i) + R_n$$

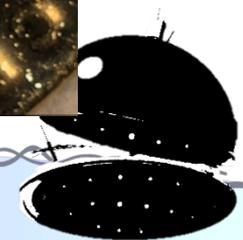


3 - Rendering



2. MODELING THE ANGULAR REFLECTANCE

✦ Assessing the image quality of the reconstructed images

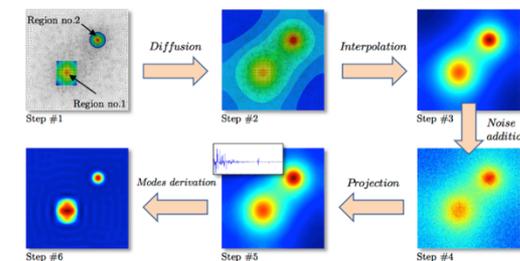
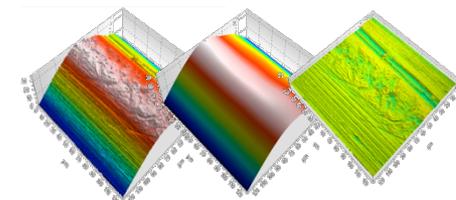
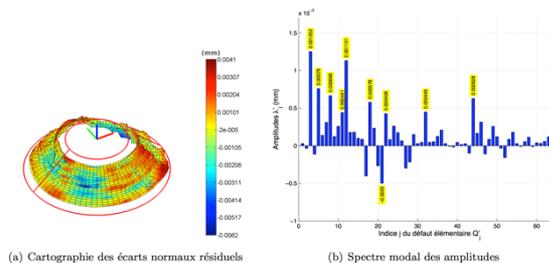


2. MODELING THE ANGULAR REFLECTANCE

Discrete Modal Decomposition

From [mechanical vibrations](#), DMD has notably been applied for:

1. **Characterization and specification of geometric deviations in form**, in the field of geometric tolerancing [1]
2. **The 3D multi-scale topographic measurements of roughness analysis** (form, waviness and roughness) [2]
3. **The estimation of spacial term of a heat diffusion problem** [3]
4. **The assessment of the angular distribution of reflectance from RTI data** [4]



Works initiated by **Serge Samper** at SYMME Laboratory and continued by:

[1] H. Favreliere, Modal Tolerancing : From metrology to specifications, Ph.D. thesis, 2009

[2] G. Le Goic and Al., Multi scale modal decomposition of primary form, waviness and roughness of surfaces, Scanning, 2011

[3] T. Pottier and Al., Proposition of a modal filtering method to enhance heat source computation..., IEJS, 2014

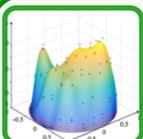
[4] G. Pitard and Al., Discrete Modal Decomposition for surface appearance modelling and rendering, Optical Metrology SPIE, 2015





1. Reflectance Transformation Imaging

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2. Modeling the angular reflectance

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3. Computing the saliency maps

- ⊕ Rotation-invariant representation
- ⊕ Multivariate analysis

4. Ongoing works

→ Change the DMD parametrization in a rotation-invariant representation to ease the detection



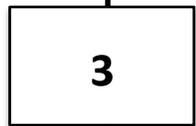
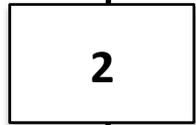
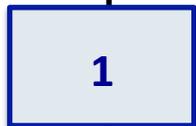
3. COMPUTING THE SALIENCY MAPS

➤ Proposal

- ❖ aim: creation of a detection method based on the modal spectra
- ➔ Detecting the significant deviations in the angular reflectance

RTI DATA
(dataset of
images)

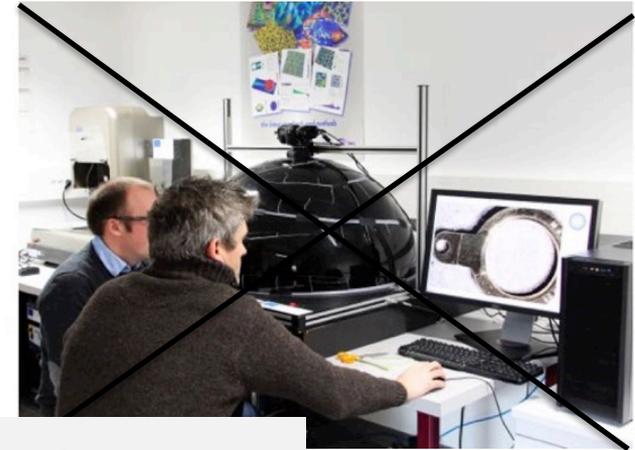
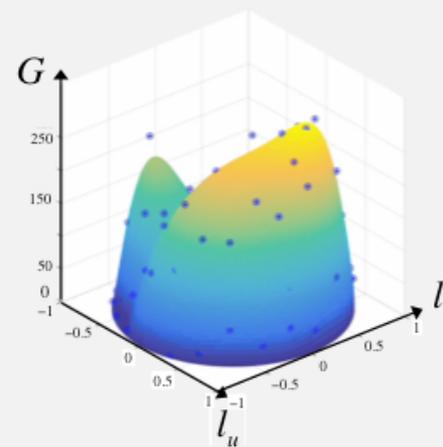
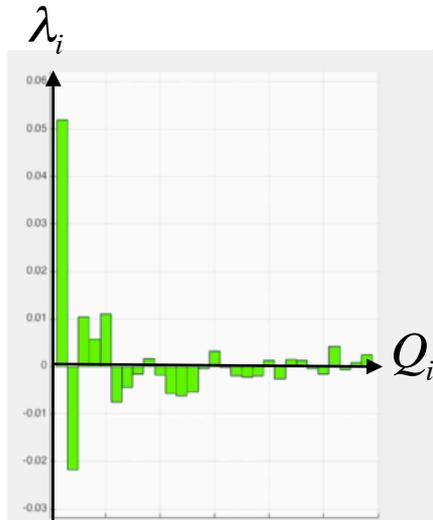
Step 1:
Discrete Modal Decomposition



D_M
**Saliency
map**

λ_i

λ'_j

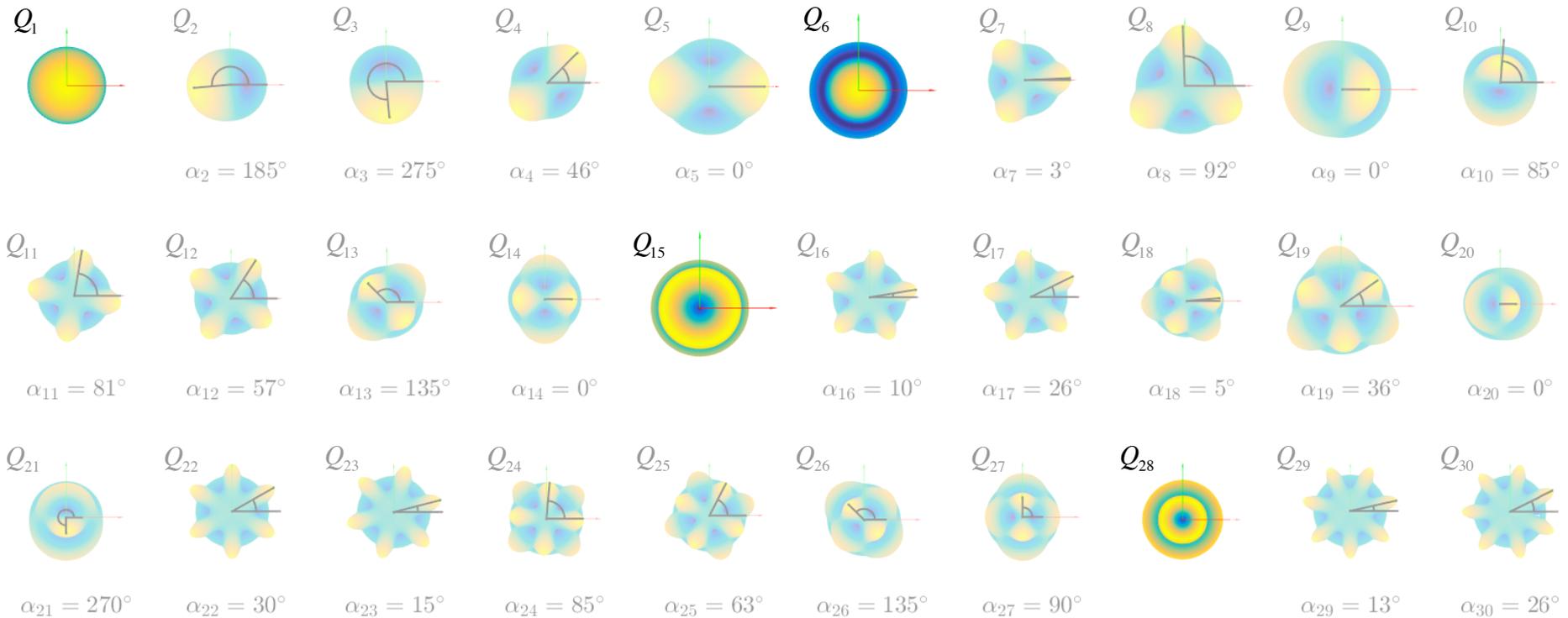


3. COMPUTING THE SALIENCY MAPS

Two families of modes in the RMB

□ **Simple modes** → rotation invariants

□ **Congruent modes**

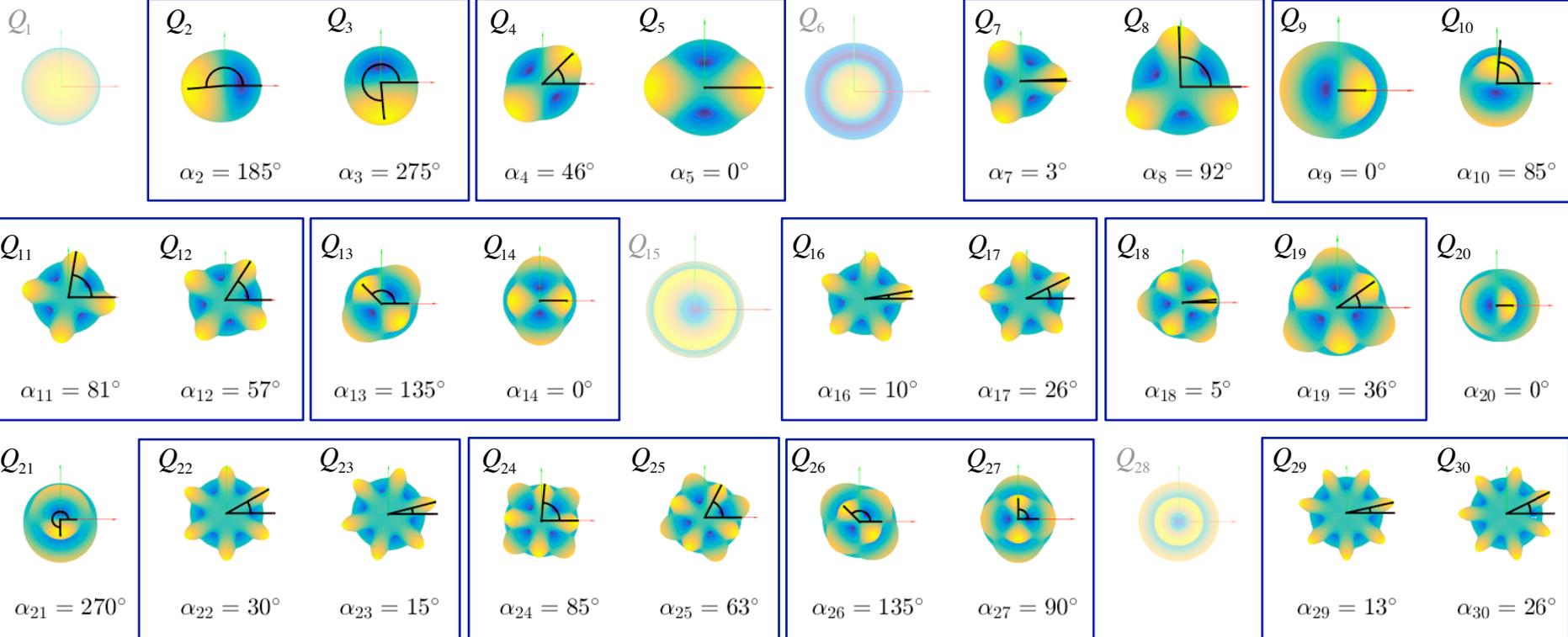


3. COMPUTING THE SALIENCY MAPS

Two families of modes in the RMB

□ Simple modes

□ **Congruent modes** → pair with the same shape but oriented differently



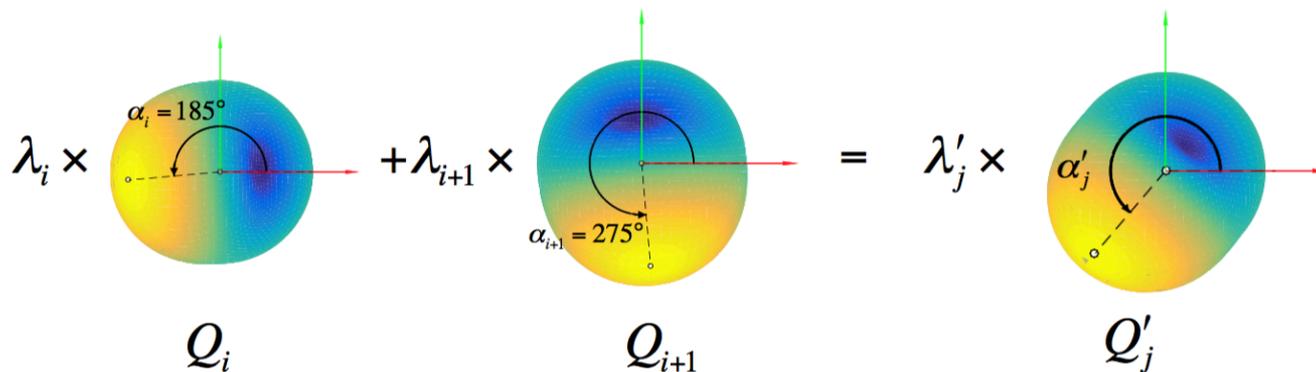
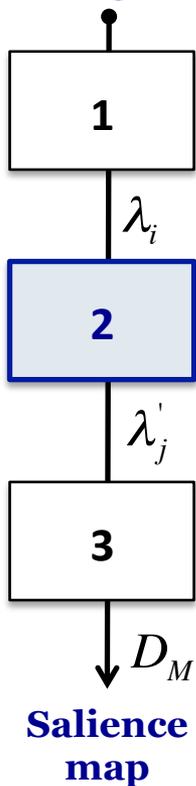
3. COMPUTING THE SALIENCY MAPS

↘ **Step 2: changing the parameterization for the congruent modes**

➔ Separating *phase-angle* and *amplitude* components

RTI DATA

(dataset of images)



□ **Amplitude** $\lambda'_j = \sqrt{\lambda_i^2 + \lambda_{i+1}^2}$ ➔ Rotational invariant component

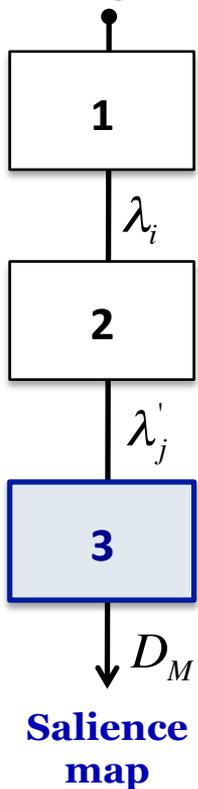
□ **Phase-angle** $\alpha'_j = \alpha_i + \arctan \frac{\lambda_{i+1} \sin(\alpha_{i+1} - \alpha_i)}{\lambda_i + \lambda_{i+1} \cos(\alpha_{i+1} - \alpha_i)}$



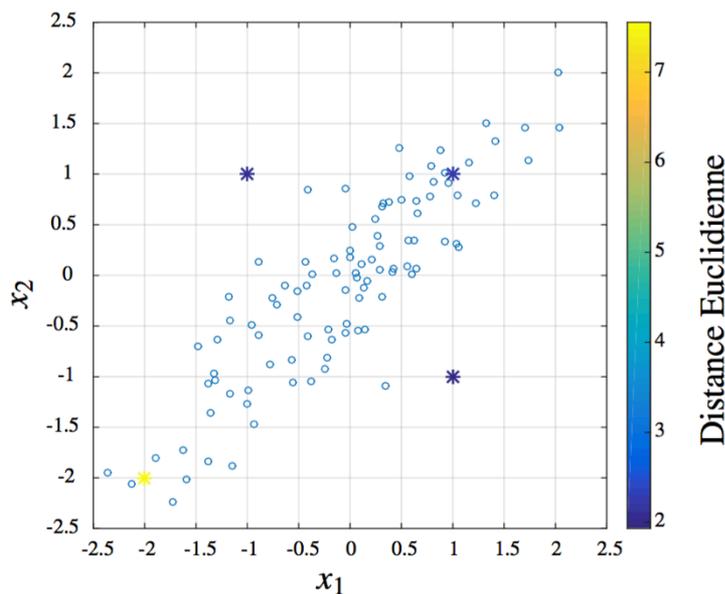
3. COMPUTING THE SALIENCY MAPS

Step 3: multivariate analysis of modal amplitudes λ_j'

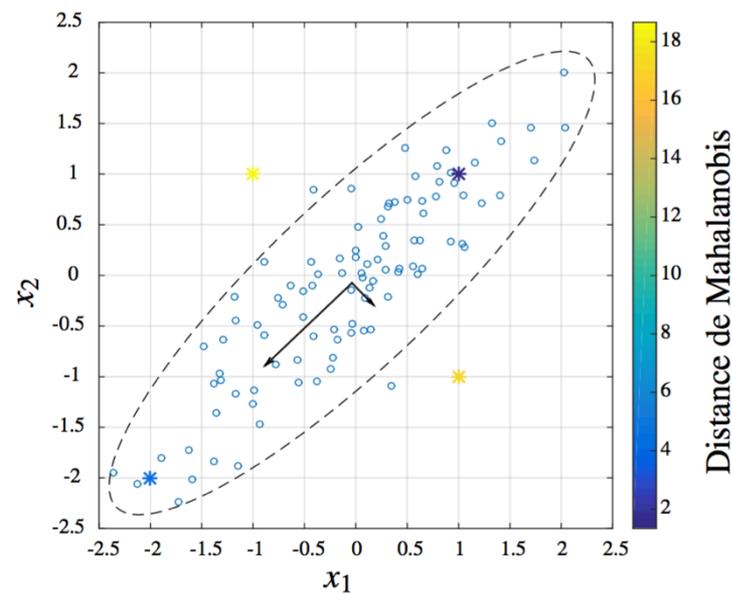
RTI DATA
(dataset of
images)



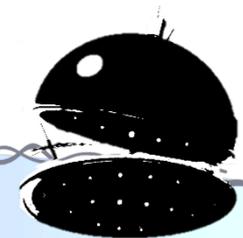
- ✓ **Mahalanobis distance:** taking into account the variance of data, the different scales between the variables, and their correlations



$$d(x) = \|x - \mu\|$$

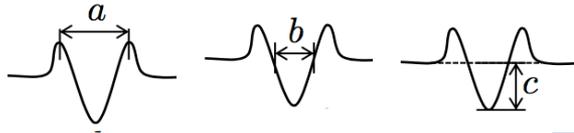
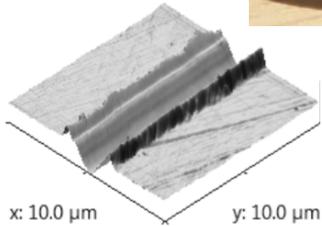
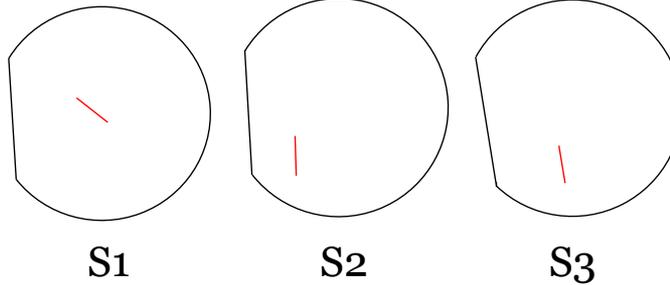
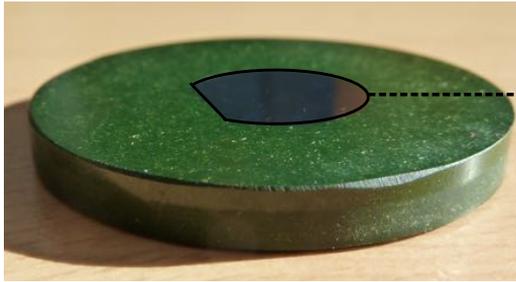


$$D_M(x) = \sqrt{(x - \mu)^T \Sigma^{-1} (x - \mu)}$$



3. COMPUTING THE SALIENCY MAPS

↘ Samples: 3 polished surfaces



Sample	a (μm)	b (μm)	c (μm)	Visibility (%)
S_1	1.25	0.75	58.32	64.6
S_2	0.98	0.61	43.57	14.5
S_3	0.68	0.44	26.1	5

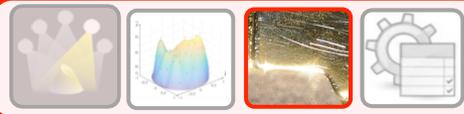


Psychophysical experiments



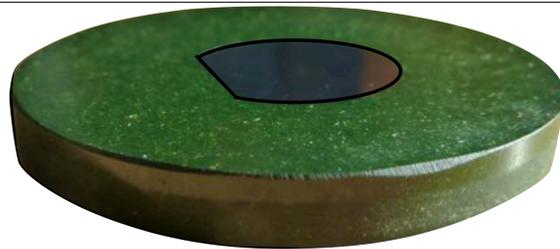
T. Puntous, et al. "Ability of quality controllers to detect standard scratches on polished surfaces," *Precision Engineering*, 2013



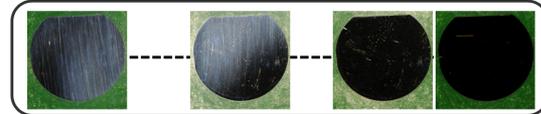


3. COMPUTING THE SALIENCY MAPS

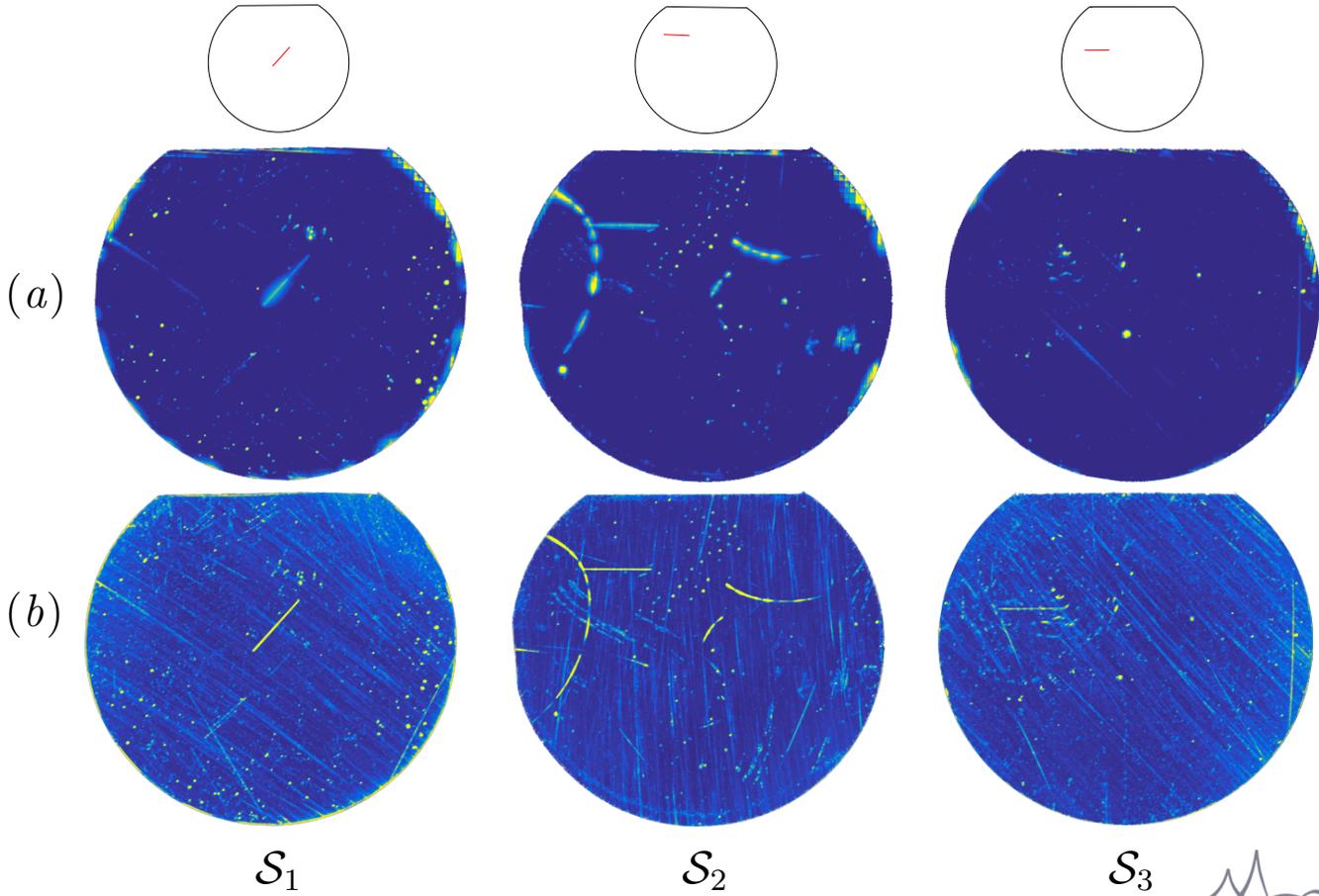
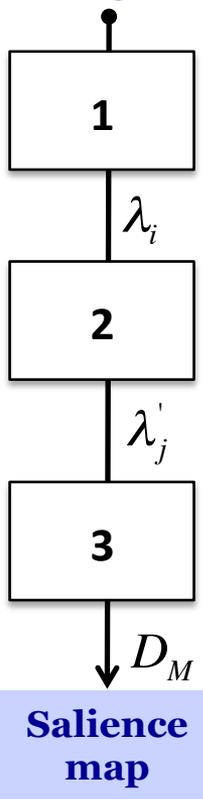
Results



RTI data acquisition

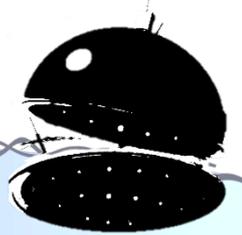


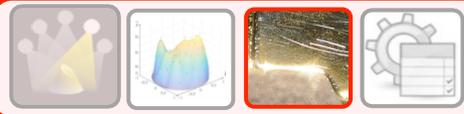
RTI DATA
(dataset of images)



Itti's method

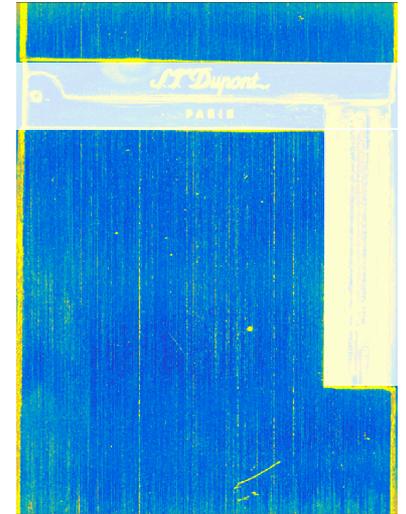
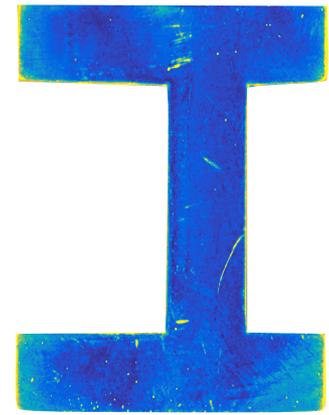
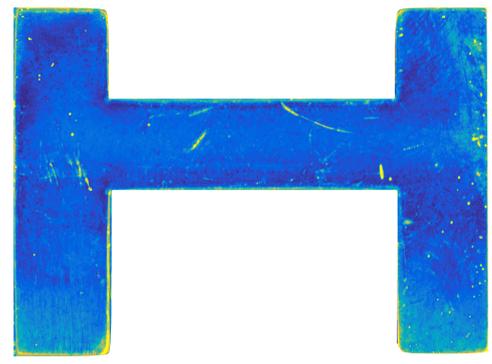
Our
(speedup ≈ 150 times)





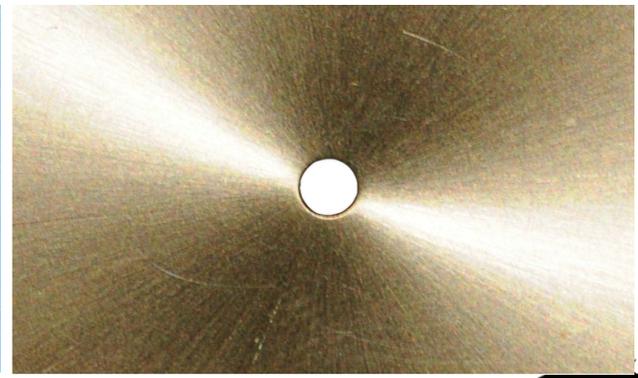
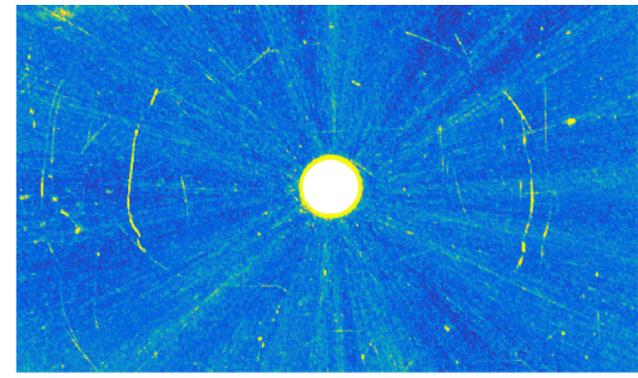
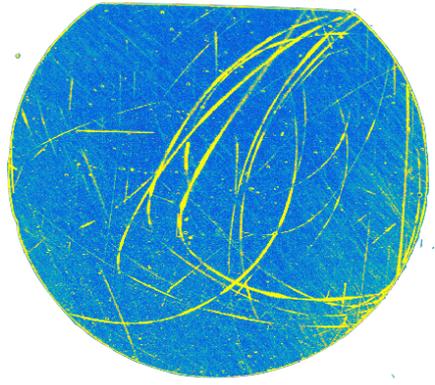
3. COMPUTING THE SALIENCY MAPS

↘ Saliency maps obtained from our methodology



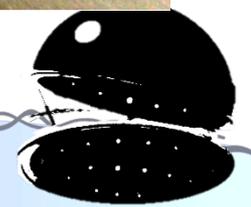
Link in a watch bracelet

Lighter body



Highly polished surface

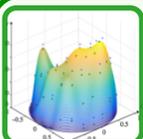
Sunray pattern dial watch





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- ⊕ RTI Devices



2. Modeling the angular reflectance

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3. Computing the saliency maps

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- ⊕ Multivariate analysis



4. Conclusion



4. CONCLUSION

✦ We claim:

- **A change in the DMD parametrization** of angular reflectances for the comparison of reflectance shapes independently from their spatial orientation
- **Detection and location of changes (saliency maps) in reflectance shape** over the inspected by performing a multivariate analysis in this rotation-invariant space

✦ Ongoing tasks:

- **Evaluation of the criticality of the detected anomalies** by using several modalities (reflectance, geometry, spectral response)



THANKS !

