# Systematic Evaluation of Binary Feature Descriptors

#### **Global Maximum**

#### Mark Muth Thomas Schöps

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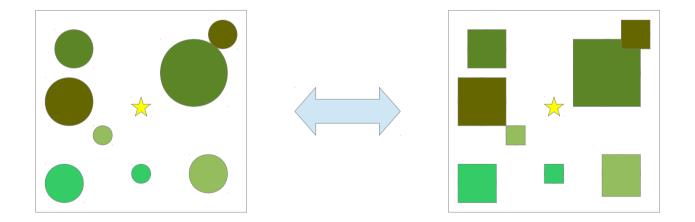
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#### Overview

- **Aim**: compute a good binary descriptor and evaluate it against common descriptors
- Presentation:
  - Method overview
  - Descriptor optimization visualization
  - Evaluation
  - Future work

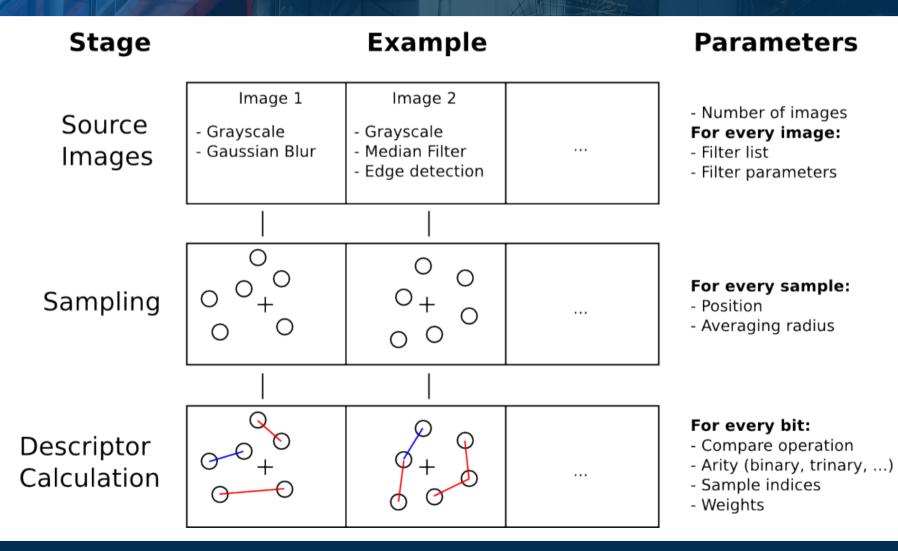
### **Input Parameters**

- Descriptor size (number of bytes)
  1
- *Future work:* Sampling method (→ performance)



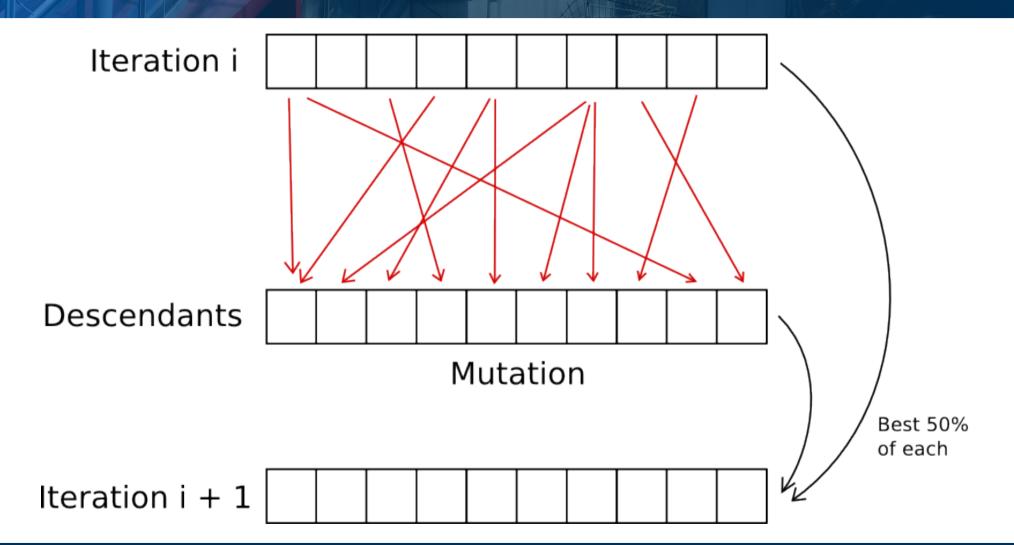
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# **Optimization Parameters**



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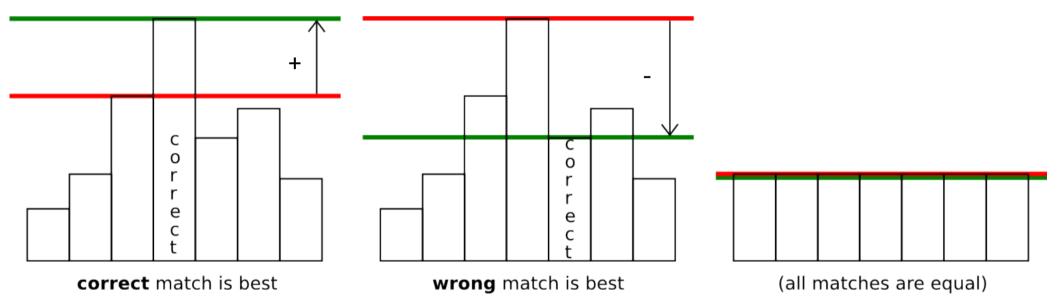
#### **Optimization Process**



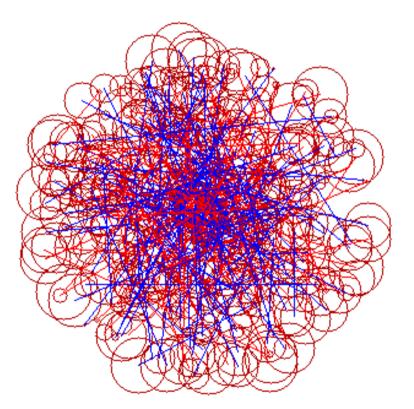
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# **Optimization Metric: Distinctiveness**

#### Brute-Force keypoint matching, then sum over all:



### **Optimization Visualization**



Iteration 0: 122

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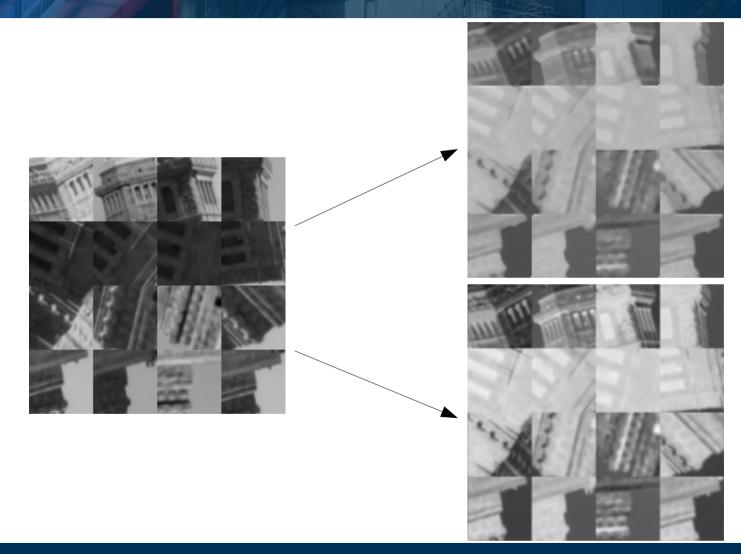
# **Overview:** Filters

- Gaussian blur
- Median filter
- Gabor filter
- Gradient magnitude



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### Filters used in optimized descriptor

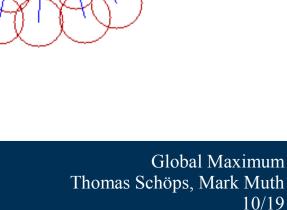


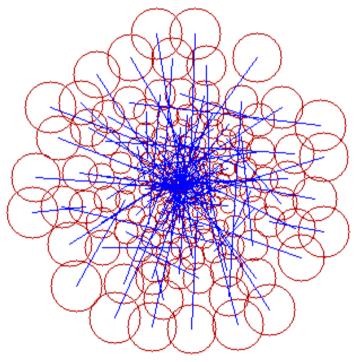
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# **Overview:** Descriptors

- CustomDescriptor
- BRIEF
- ORB
- BRISK

 Parameter optimization for all except BRIEF (parameterless)

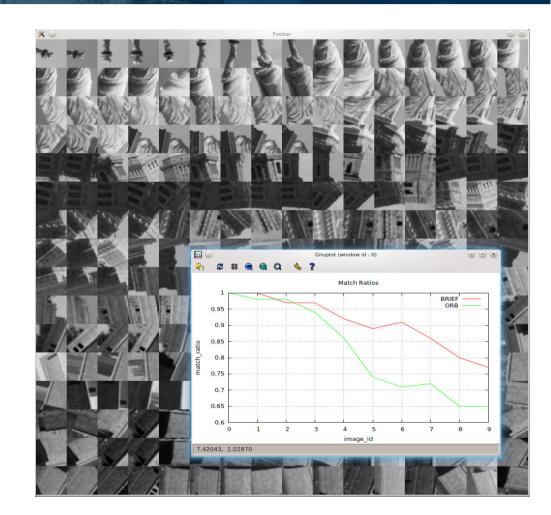




lteration 0: -275

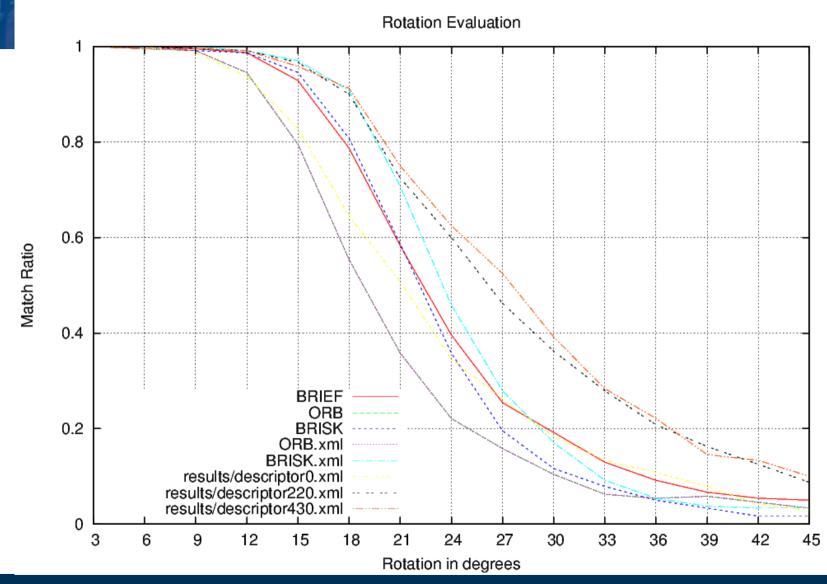
# **Overview:** Evaluation

- Rotation
- Scale
- Perspective
- Noise: Gaussian
- Noise: Salt and Pepper
- Lighting
- ROC Curves

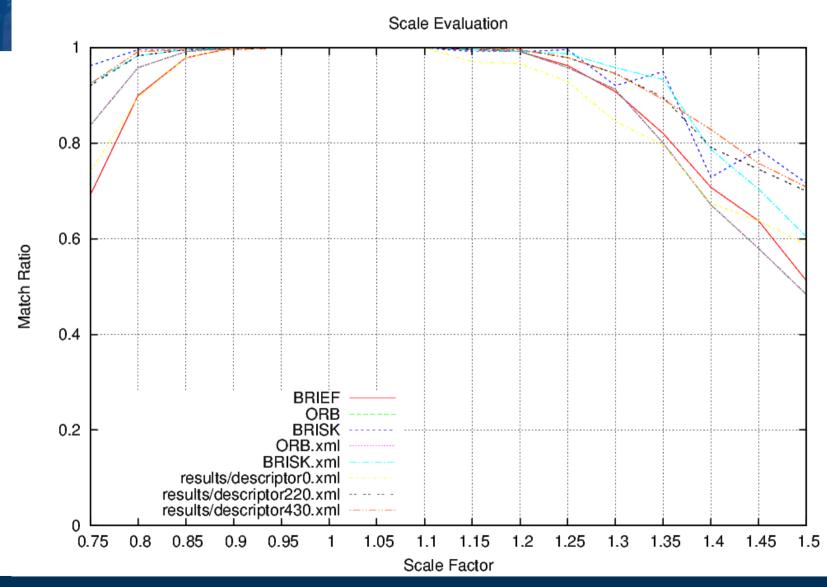


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# Rotation

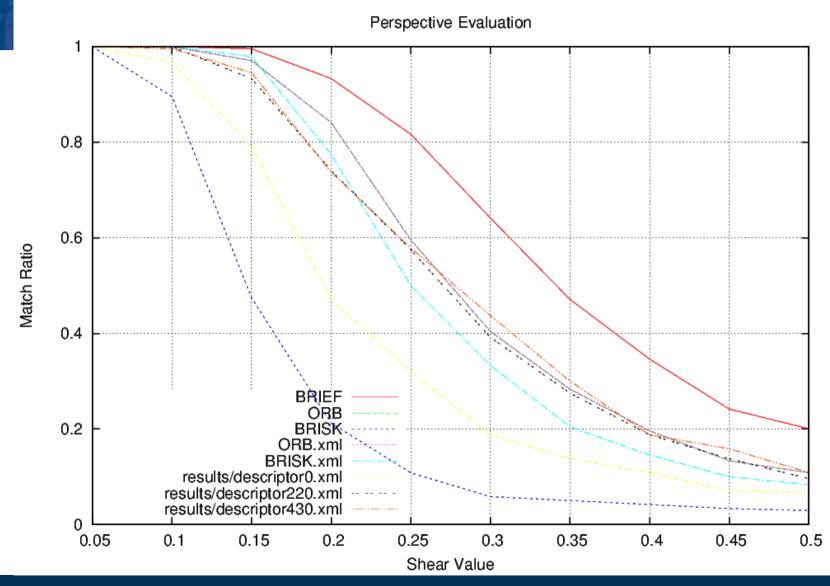


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### Perspective



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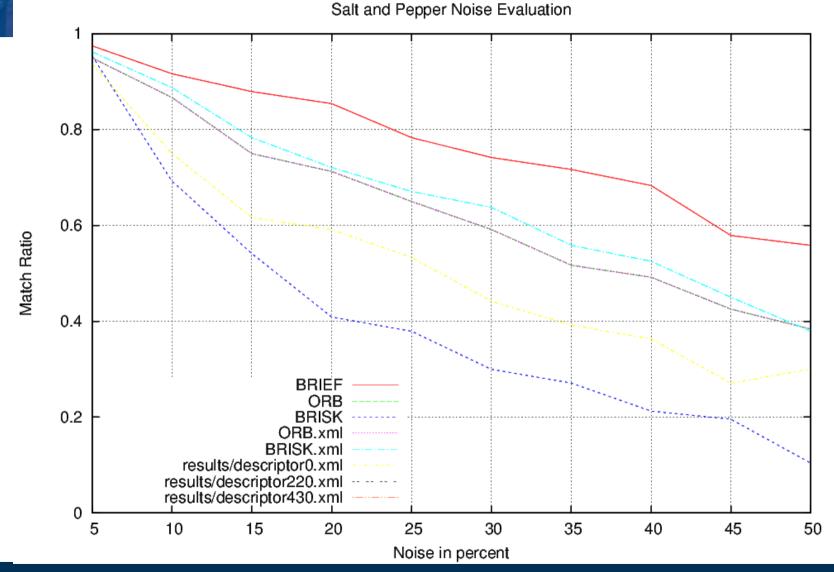
### Noise: Gaussian

0.8 0.6 Match Ratio 0.4 BRIEF ORB 0.2 BRISK ORB.xml BRISK.xml results/descriptor0.xml results/descriptor220.xml results/descriptor430.xml 0 20 30 50 60 70 80 90 100 10 40 Sigma

Gaussian Noise Evaluation

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# Noise: Salt and Pepper



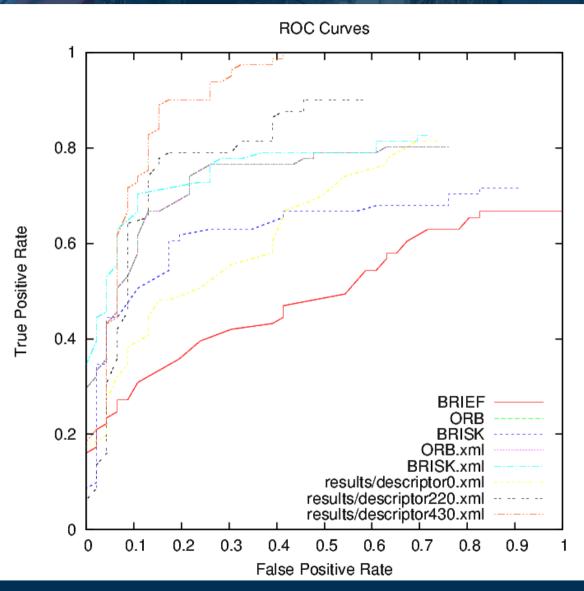
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# Lighting

Illumination Changes Evaluation 1 0.8 0.6 Match Ratio 0.4 BRIEF ORB BRISK 0.2 ORB.xml BRISK.xml results/descriptor0.xml results/descriptor220.xml results/descriptor430.xml 0 1.1 1.2 1.3 1.4 1.5 1.6 1.7 1.8 1.9 2 Factor

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## **ROC Curves**



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#### Future work

- Avoid overfitting
- Avoid local maxima of optimization metric.
  Simulated annealing? Less unknowns?
- Improve handling of negative metric values. Penalty for samples which are always equal?
- Try more filters, bit parameters, etc.
- Integrate FREAK for comparison (problem: skipped some keypoints)