



# Evaluation of Face Image Quality Metrics in Person Identification Problem

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# Quality assessment problem

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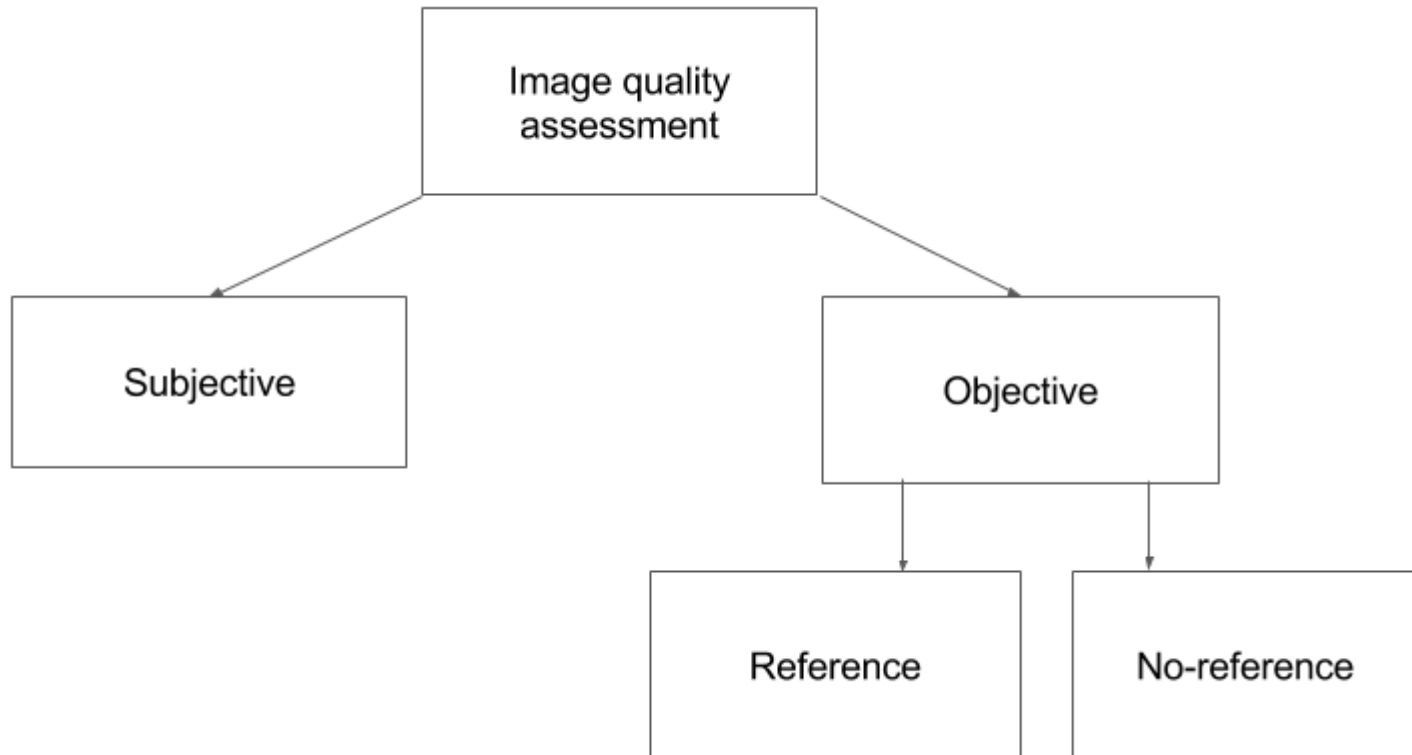
Reference image



Distorted image (JPEG2000)

# Quality assessment algorithms

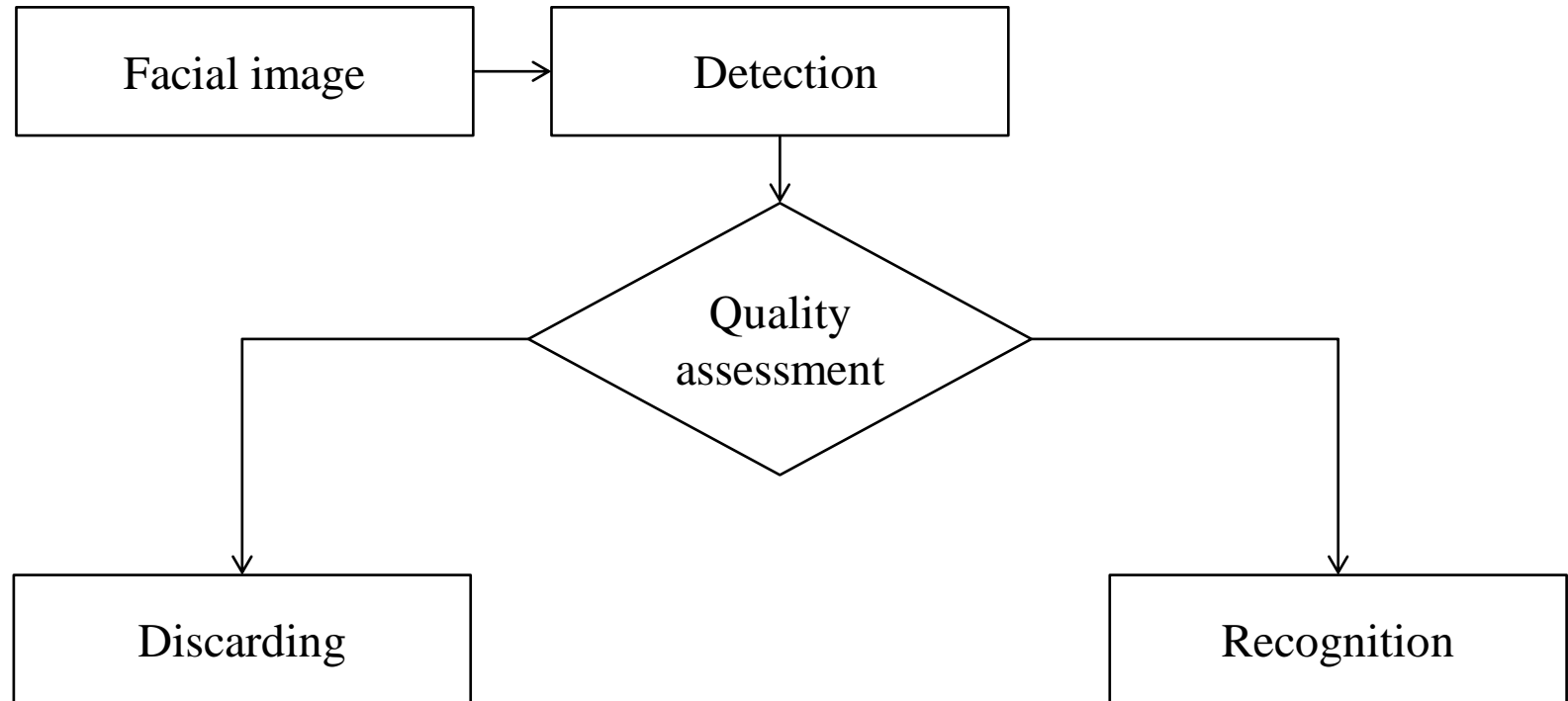
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ITU-R BT.500-11 – methodology for subjective quality assessment tests

# Facial identification system

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# Facial image quality features

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Texture

Contrast  
Compression ratio  
Illuminance

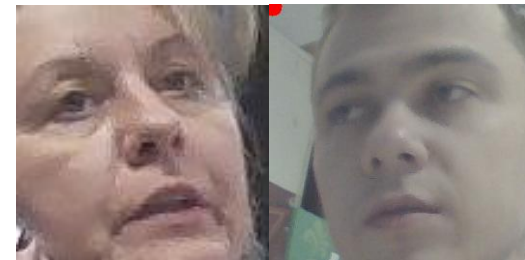
**Facial image quality standards:**  
ISO/IEC 19794-5, ICAO 9303



Geometry

Symmetry  
Pose  
Rotation  
Eye visibility

**In practice:**



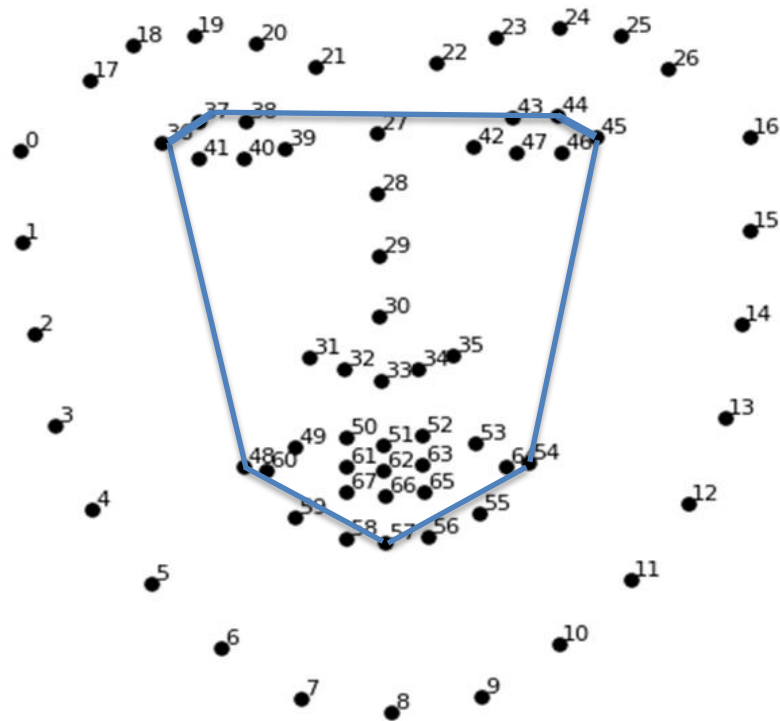
# Facial image quality assessment

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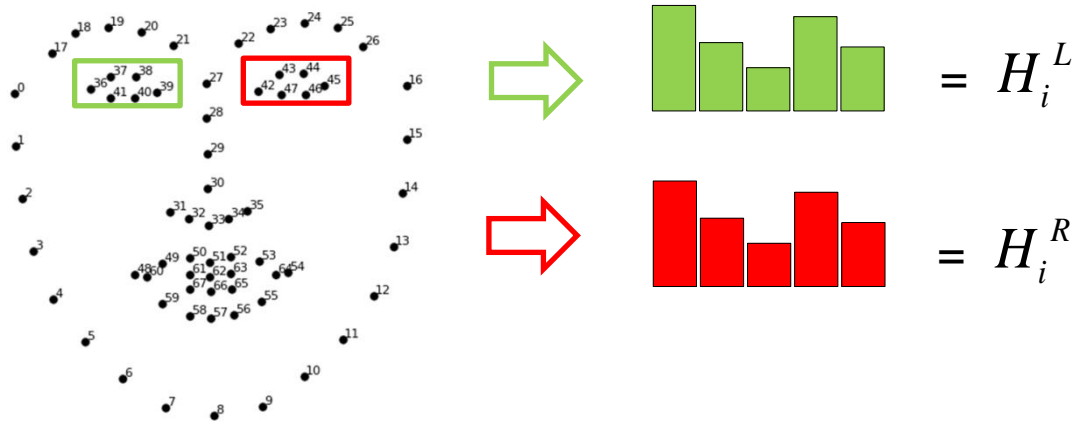
- Based on learning to rank
- Feature fusion
  - Resolution
  - Sharpness
  - Symmetry
  - Symmetry of landmarks points
  - Other no-reference image quality metrics

# Sharpness

$$L(I) = \left| \frac{\partial^2 I}{\partial x^2} \right| + \left| \frac{\partial^2 I}{\partial y^2} \right|$$



# Symmetry



$$d(i) = \sum_i \min(H_i^L, H_i^R)$$

$$S = \text{Symmetry}(I) = \frac{1}{N} \sum_{i=1}^N d(i)$$

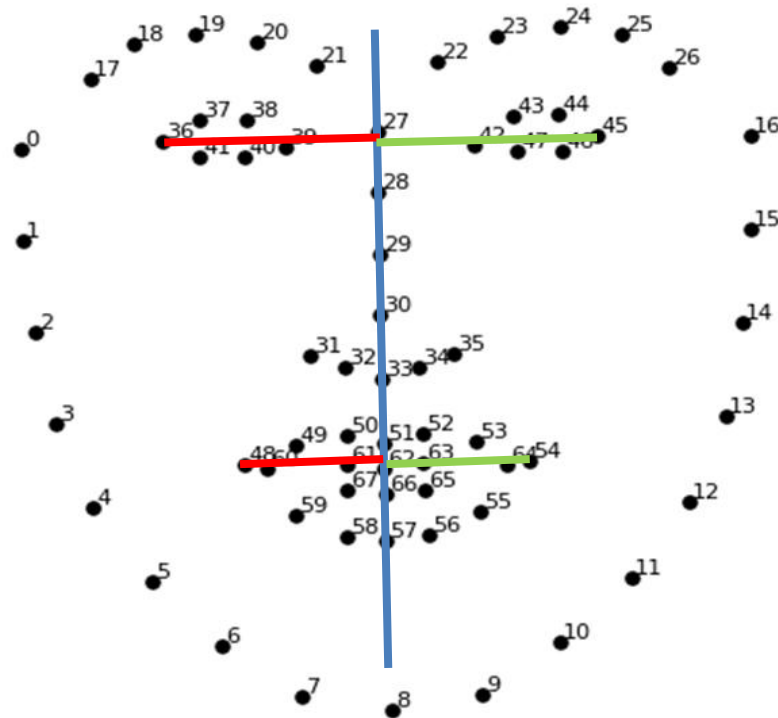
Nikitin M., Konushin A., Konushin V. Face quality assessment for face verification in video // Proceedings of GraphiCon'2014, 2014. — P. 111–114



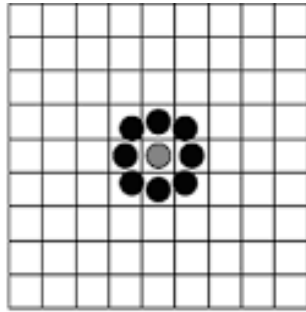
# Symmetry of landmarks points

$$S = \frac{|d_{35} - d_{31}| + |d_{42} - d_{39}| + |d_{45} - d_{36}| + |d_{54} + d_{48}|}{w}$$

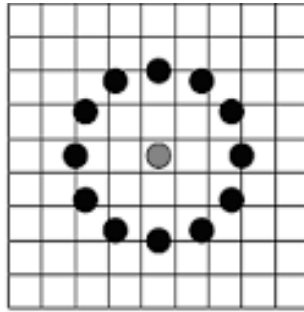
*w* – face bounding box width



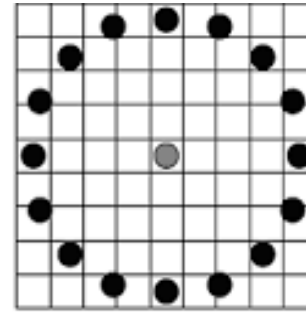
# NRQ LBP



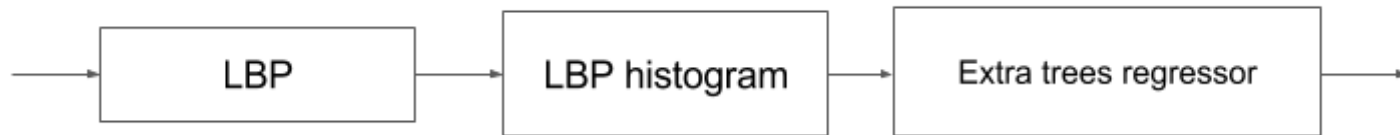
$P=8, r=1$



$P=12, r=2$



$P=16, r=4$



Multiscale universal rotation invariant LBP with:  $r = 1, 2, 3$ ;  $P = 8, 16, 24$

I. Nenakhov, V. Khryashchev and A. Priorov, "No-Reference Image Quality Assessment based on Local Binary Patterns", *Proceedings of the 14th IEEE EAST-WEST DESIGN & TEST SYMPOSIUM*, 2016, pp. 529–532.

# LBP histogram for distorted image (JPEG)

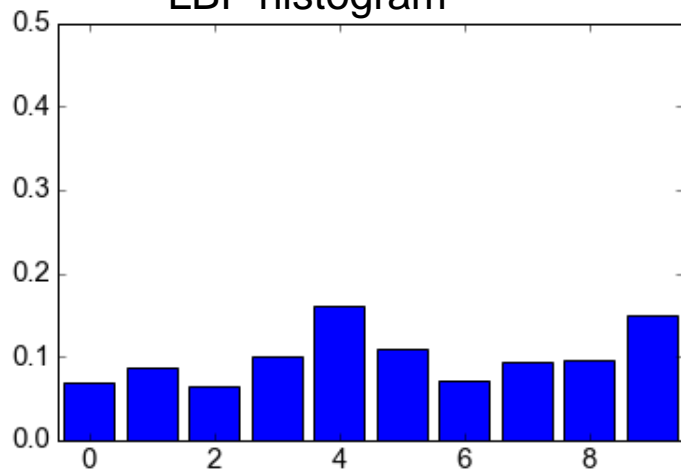
Reference



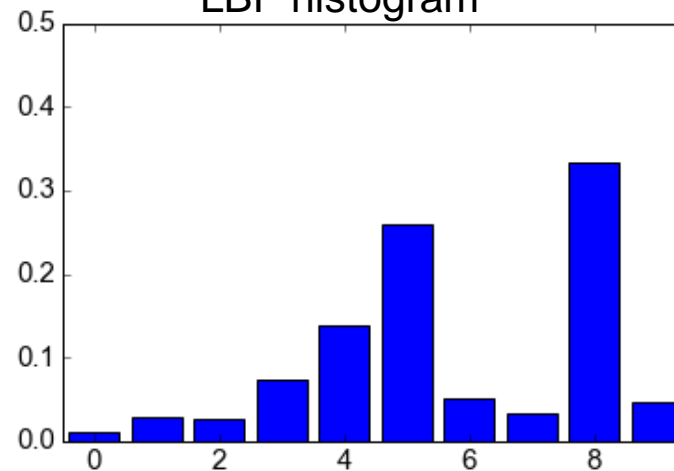
JPEG



LBP histogram



LBP histogram



# LBP histogram for distorted image (JPEG2000)

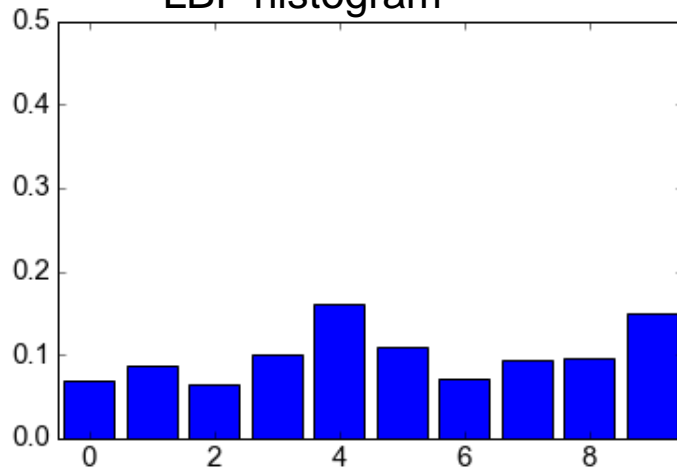
Reference



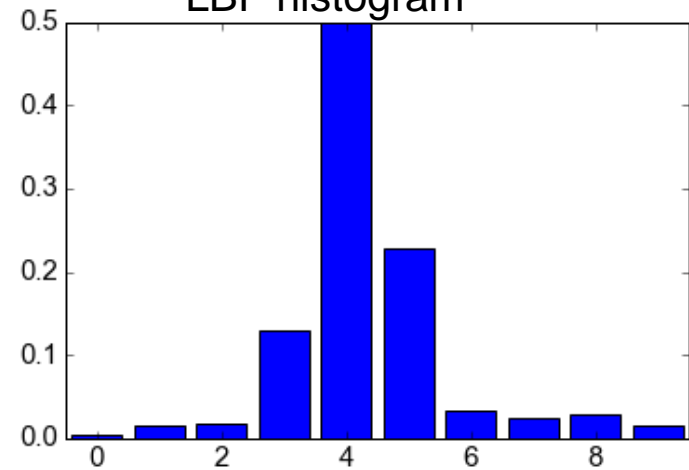
JPEG2000



LBP histogram



LBP histogram



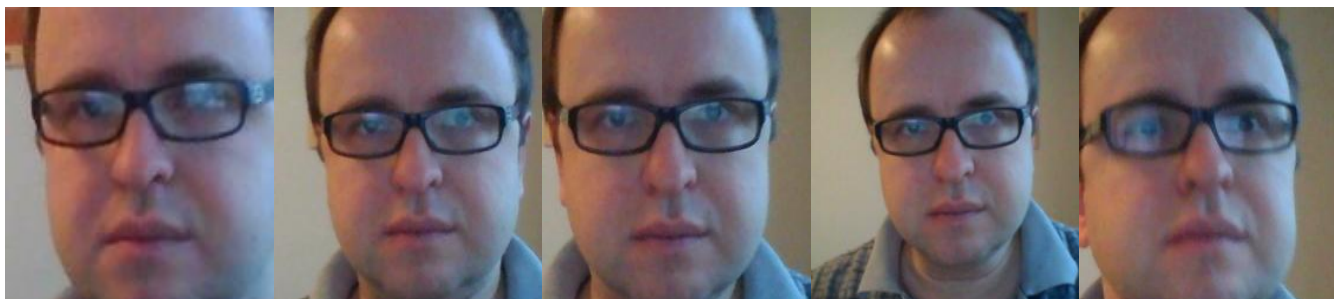
# KFCD dataset



**20 lx**

**130 lx**

**180 lx**



10 test video sequences with different lighting conditions

# Spearman rank correlation coefficient for FQA metrics

Illuminance, lx	K	Resolution	Sharpness	S	NRQ LBP	BRISQUE	Symmetry
20	0.02	0.40	-0.17	-0.05	0,25	0,33	0.02
50	<b>0.36</b>	-0.03	0.03	0.05	-0,13	-0,23	0.15
75	-0.37	-0.09	-0.06	-0.15	-0,004	-0,28	<b>0.23</b>
130	0.1	0.36	-0.1	<b>0.45</b>	0,33	<b>0,73</b>	0.28
180	-0.03	-0.09	-0.21	<b>0.06</b>	0,1	-0,25	0.05
500	0.10	-0.15	-0.30	<b>0.28</b>	<b>0,79</b>	-0,06	0.22

# TOP-3 ACCURACY OF FACIAL IMAGE QUALITY METRICS (KFCD DATASET)

Illuminance, lx	Presence of glasses	K	Resolution	Sharpness	S	NRQ LBP	BRISQUE	Symmetry
20	-	1	1	1	1	0	0	1
20	+	2	0	2	1	0	2	2
50	-	1	1	1	0	0	0	1
50	+	<b>3</b>	0	0	2	0	1	2
75	-	1	1	0	2	0	1	0
75	+	2	1	1	1	2	1	0
130	-	2	1	1	1	1	0	0
180	-	<b>3</b>	0	1	2	1	0	1
180	+	0	0	0	1	1	1	1
500	+	2	0	0	1	1	0	1
<b>Total</b>		<b>17</b>	<b>5</b>	<b>7</b>	<b>12</b>	<b>6</b>	<b>6</b>	<b>9</b>



# 60PFCD dataset

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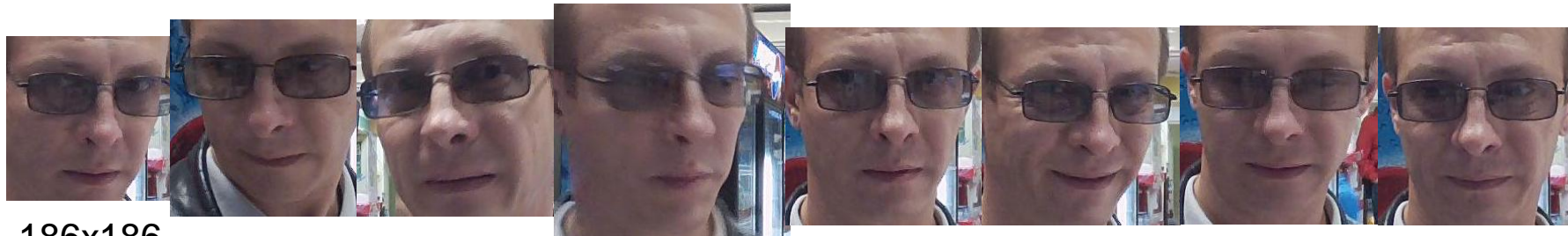


60 persons

10 image for each person



# 60PFCD dataset



186x186

268x267

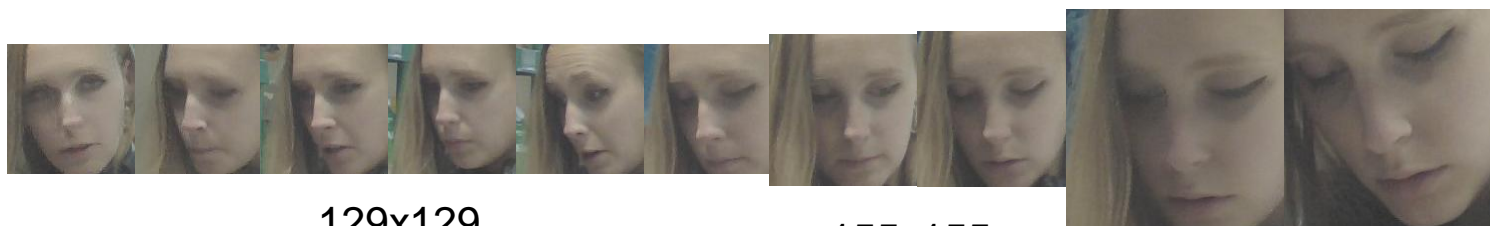
232x232



108x108

268x268

223x223



129x129

155x155

233x233

# Accuracy of FQA metrics on 60PFCD dataset

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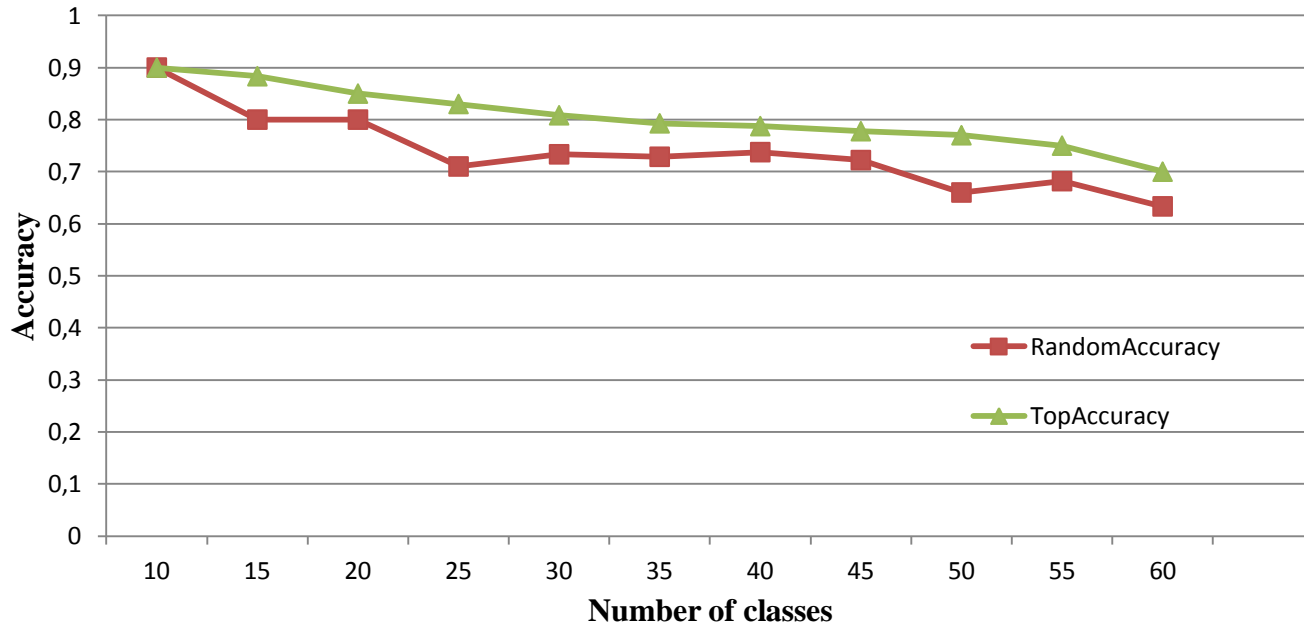
## TOP-1 ACCURACY OF FACIAL IMAGE QUALITY METRICS

<b>K</b>	<b>Resolution</b>	<b>Sharpness</b>	<b>S</b>	<b>NRQ LBP</b>	<b>BRISQUE</b>	<b>Symmetry</b>
20	6	7	7	4	7	10

## TOP-3 ACCURACY OF FACIAL IMAGE QUALITY METRICS

<b>K</b>	<b>Resolution</b>	<b>Sharpness</b>	<b>S</b>	<b>NRQ LBP</b>	<b>BRISQUE</b>	<b>Symmetry</b>
99	65	60	73	49	52	68

# Accuracy of FQA metrics on 60PFCD dataset



# Conclusions

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- Face image quality assessment metric based on learning to rank has higher top3 accuracy values on 60PFCD and FFCD datasets
  
- The accuracy of the no-reference NRQ LBP metric depends on the luminance level. It performs well when luminance is more than 100 lx.



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