



# FaceQnet: A Deep Learning Face Quality Measure

**Javier Galbally**

European Commission – DG Joint Research Centre  
Unit E.3: Cyber and Digital Citizens' Security

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NIST-EAB Workshop on Face Image Quality*

# FaceQnet: Brought to you by UAM + DG JRC

UAM: BIDA Lab

**UAM**

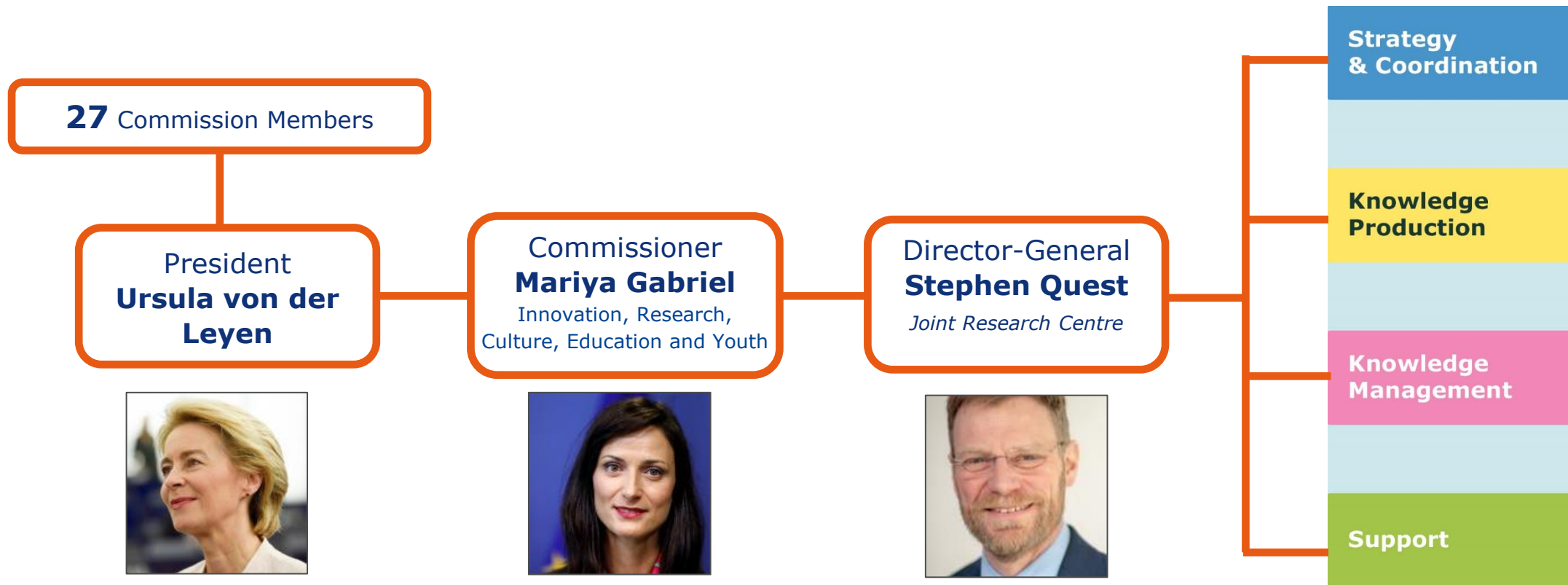
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de Madrid



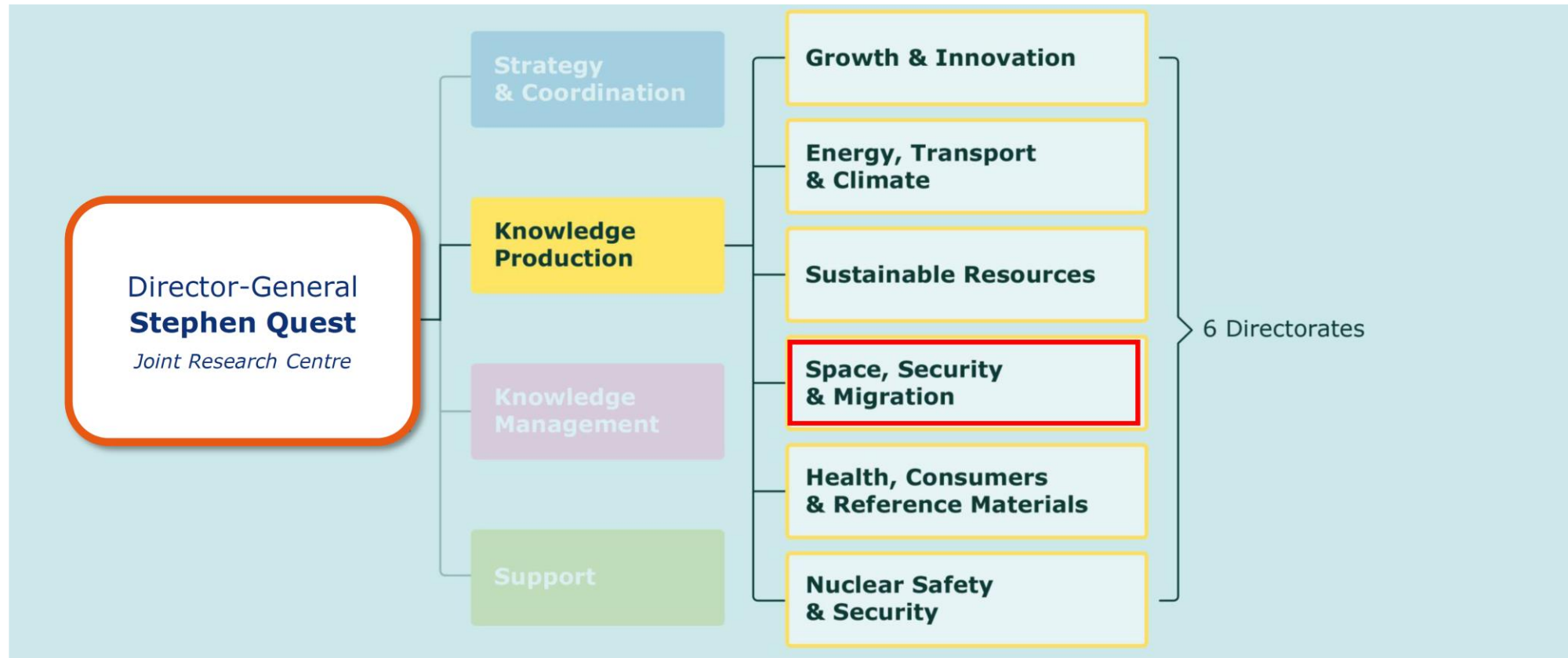
**BIOMETRICS**

<http://biometrics.eps.uam.es/>

# EC: DG-JRC E.3



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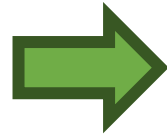
# FaceQnet: Initial Remarks

# FaceQnet: A predictor of accuracy

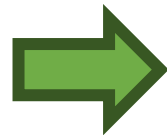
## UTILITY DEFINITION:

Biometric **quality**  
is a **PREDICTOR** of  
biometric **accuracy**

# FaceQnet: One input one single score



**10**

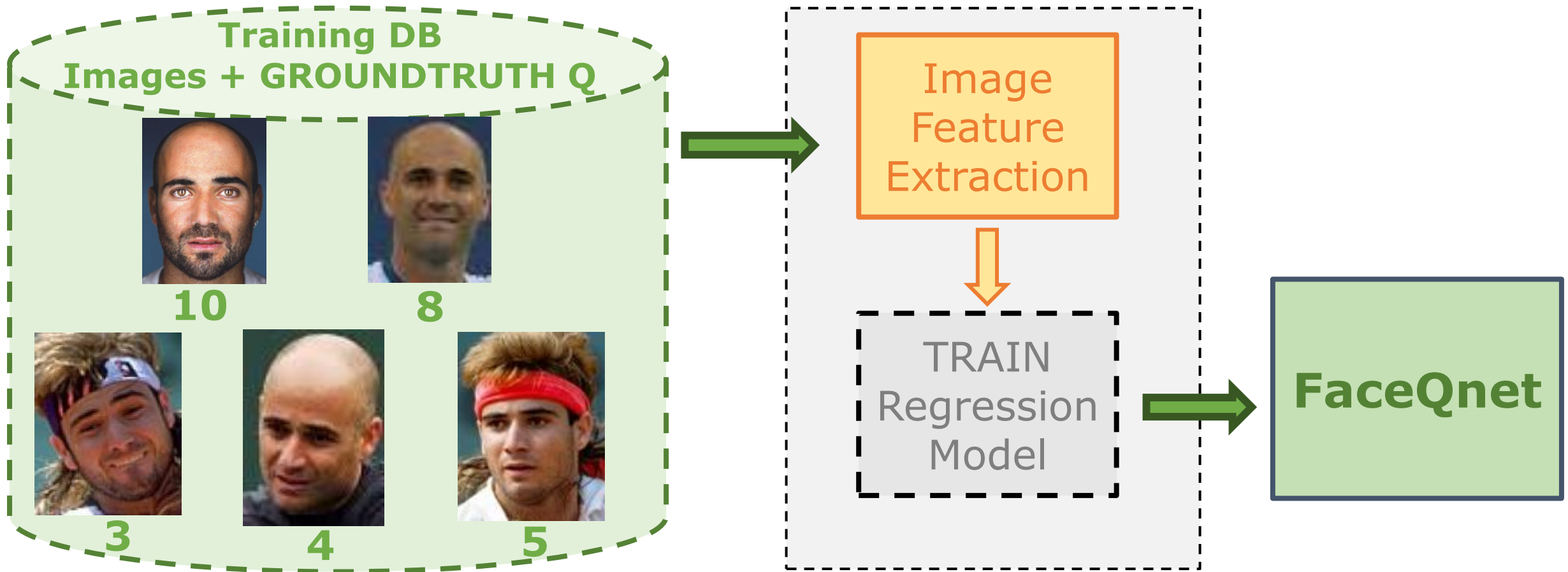


**3**

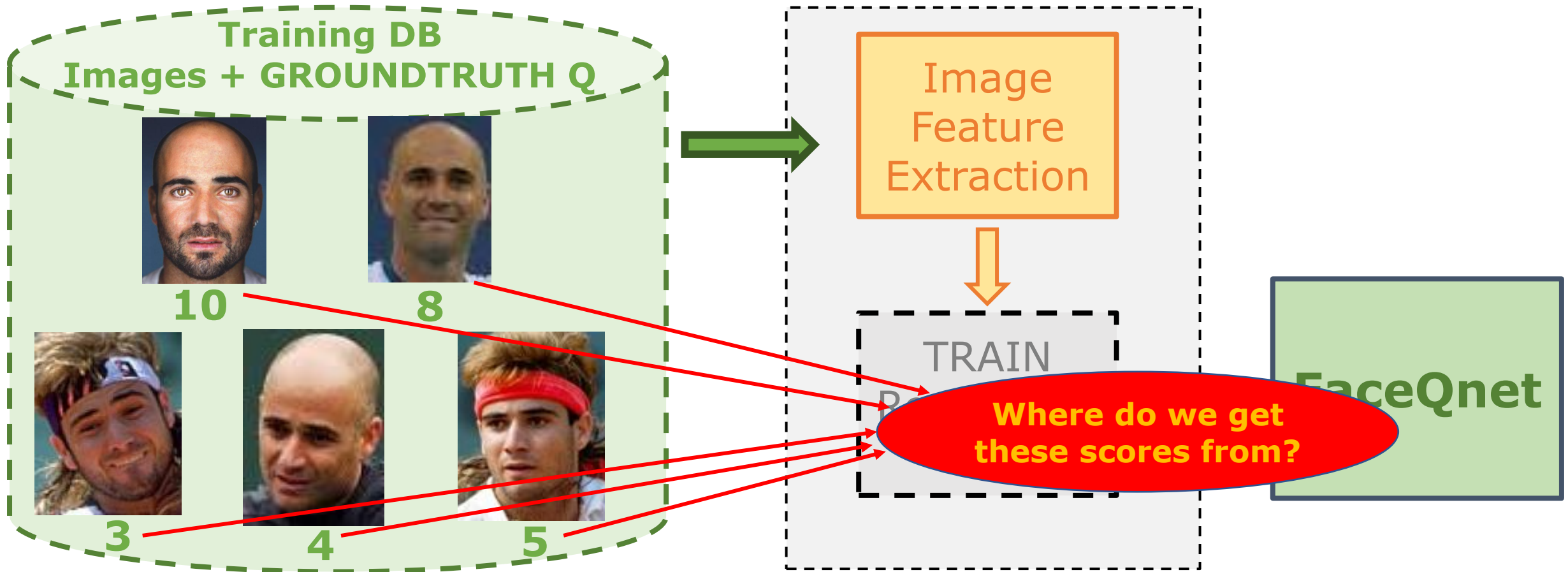


# Development of FaceQnet: Challenges and solutions

# FaceQnet at a glance



# CHALLENGE 1: Groundtruth scores



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## CHALLENGE 1

Definition of the GROUNDTRUTH quality scores

(Quality is a SUBJECTIVE concept,  
how can we define the OBJECTIVE groundtruth scores?)

# CHALLENGE 1: Groundtruth scores

**We want to predict accuracy  
(i.e., mated comparison scores) so...**

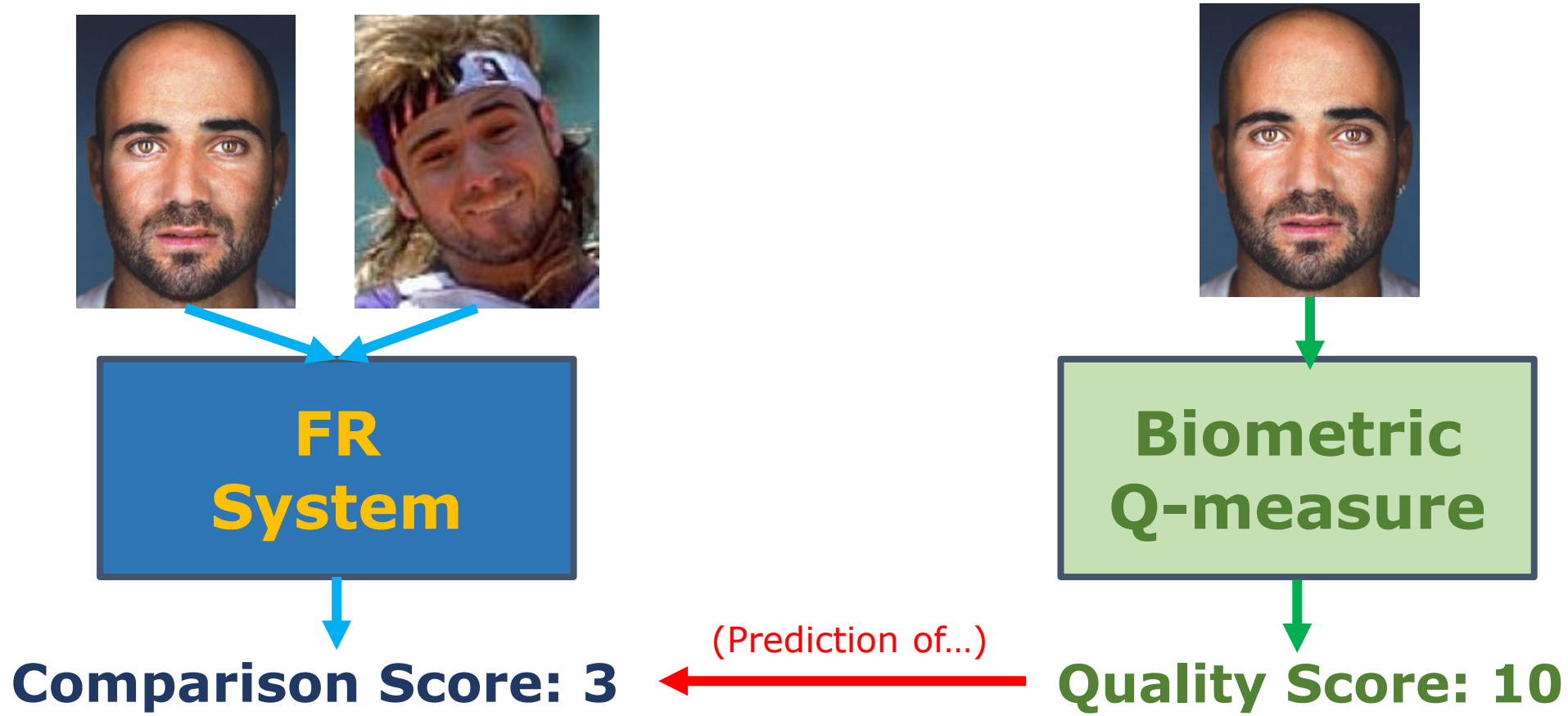
**Let's use mated comparison scores  
as groundtruth quality scores**

# CHALLENGE 1: Groundtruth scores

## The quality paradox

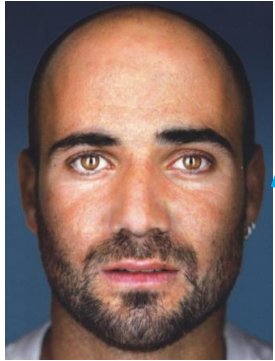
With only ONE input  
we have to predict the output  
of a system with TWO inputs

# CHALLENGE 1: Groundtruth scores



# CHALLENGE 1: Groundtruth → Our solution

Sample A: **PERFECT** quality (10/10)



Sample B: Other quality (3/10)

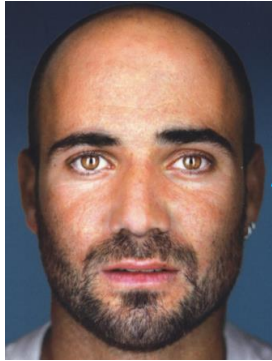


**Comparison  
Score: 3**



# CHALLENGE 1: Groundtruth → Our solution

Sample A: **PERFECT** quality (10/10)



Sample B: Other quality (3/10)

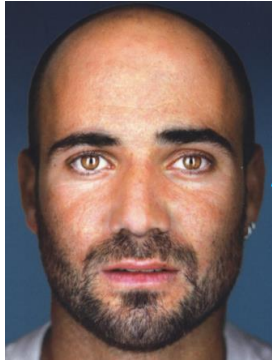


**Comparison  
Score: 3**



# CHALLENGE 1: Groundtruth → Our solution

Sample A: **PERFECT** quality (10/10)



Sample B: Other quality (3/10)



Use multiple training systems to minimise system dependency!

Comparison Score: 3

QUALITY Groundtruth for...

# CHALLENGE 1: Groundtruth → Our solution

## **HYPOTHESIS:**

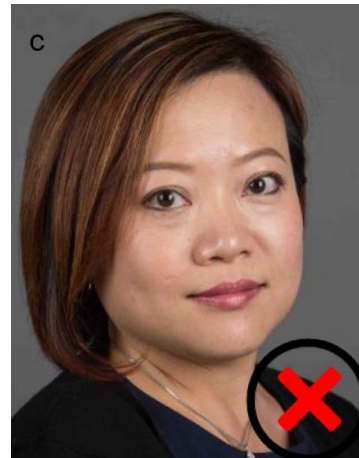
**Given a sample A of perfect quality  
and a sample B of any quality,  
the comparison score will reflect the quality of sample B**

- It predicts machine accuracy
- Machines do not get tired
- Fully scalable

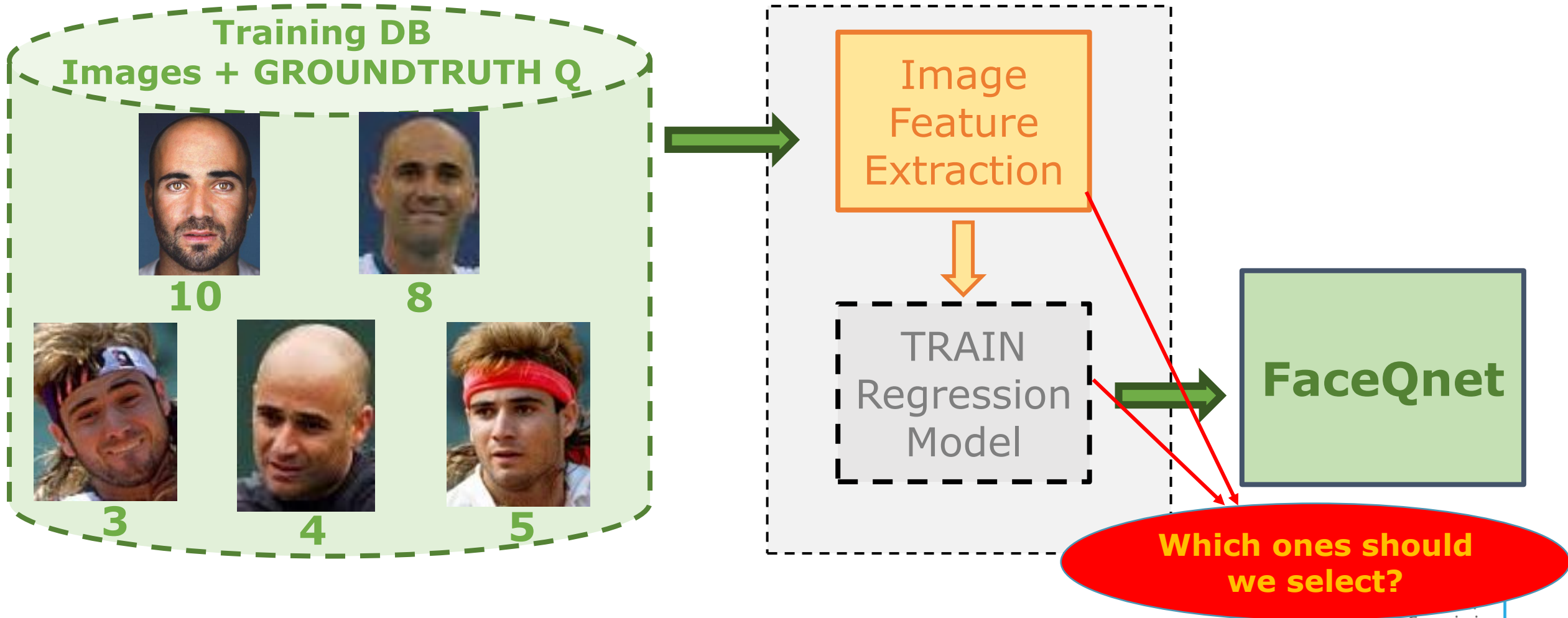
**Who defines “PERFECT” quality?**

# CHALLENGE 1: Groundtruth → Our solution

PERFECT quality is referred to compliance with  
**ISO/IEC 39794-5**  
(MRTD requirements, ICAO)



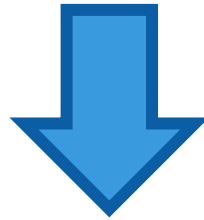
# CHALLENGES 2+3: Feature Extraction + Reg. Model



## CHALLENGE 2+3: Our solution

### **DEEP LEARNING**

(if you cannot beat the machine, let her do it)

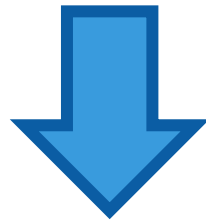


**Deep Learning sounds good but,  
IT NEEDS A GREAT AMOUNT OF  
TRAINING DATA**

## CHALLENGE 2+3: Our solution

### **HYPOTHESIS:**

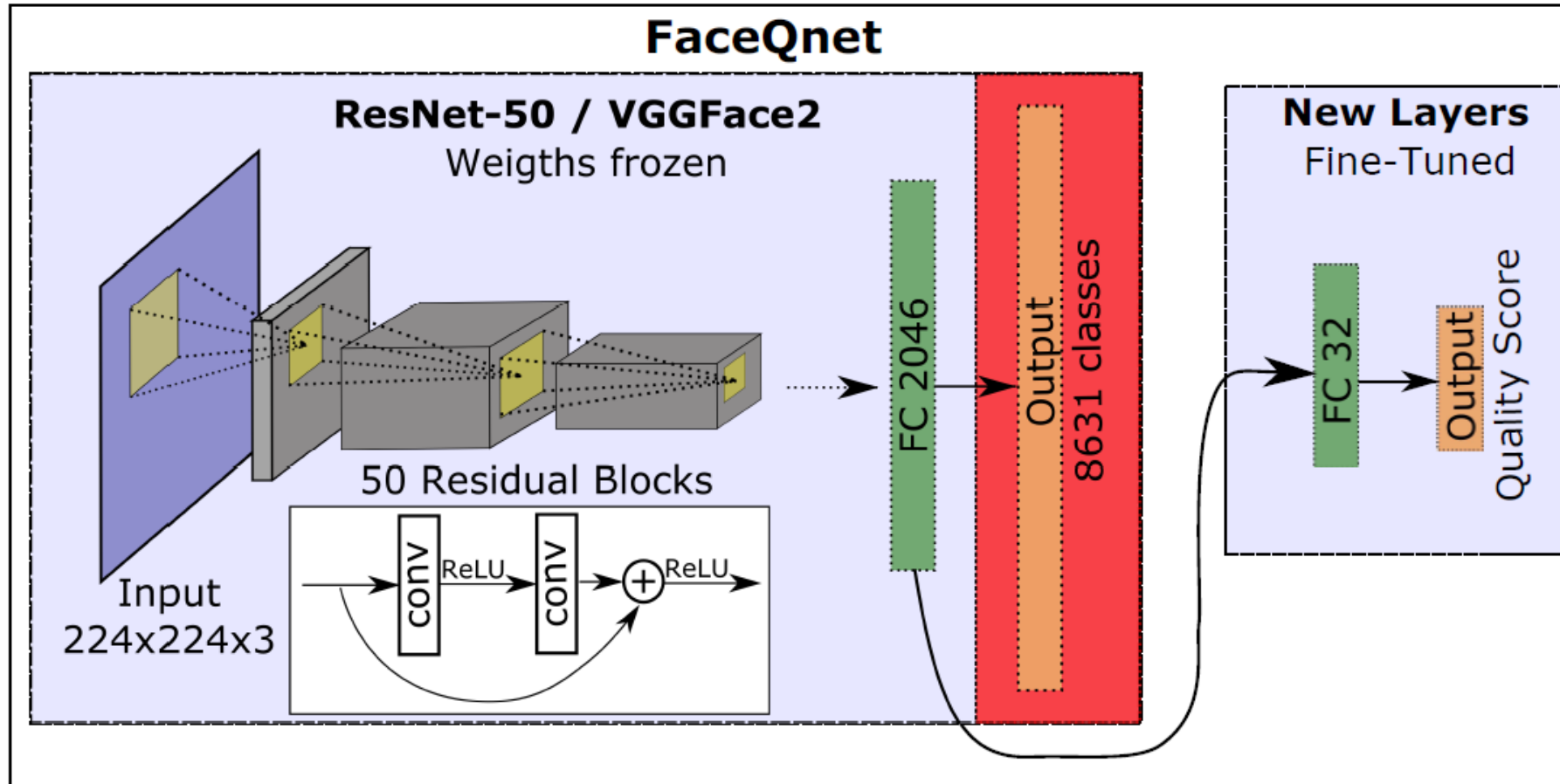
**Features that comprise the identity of faces (ACCURACY), are expected to also comprise the information of their QUALITY**



**Knowledge transfer**

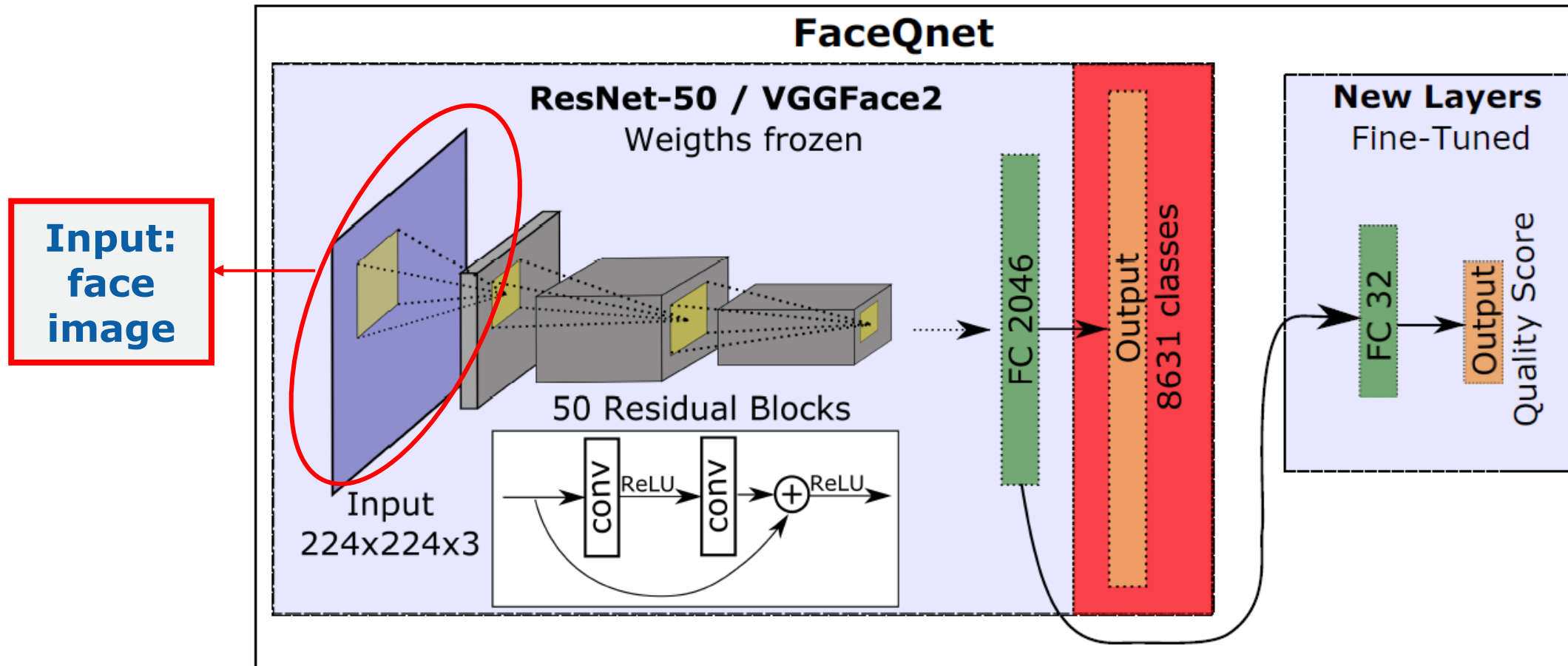
**Use a CNN trained for FR as basis for Q-estimation**

# CHALLENGE 2+3: Our solution

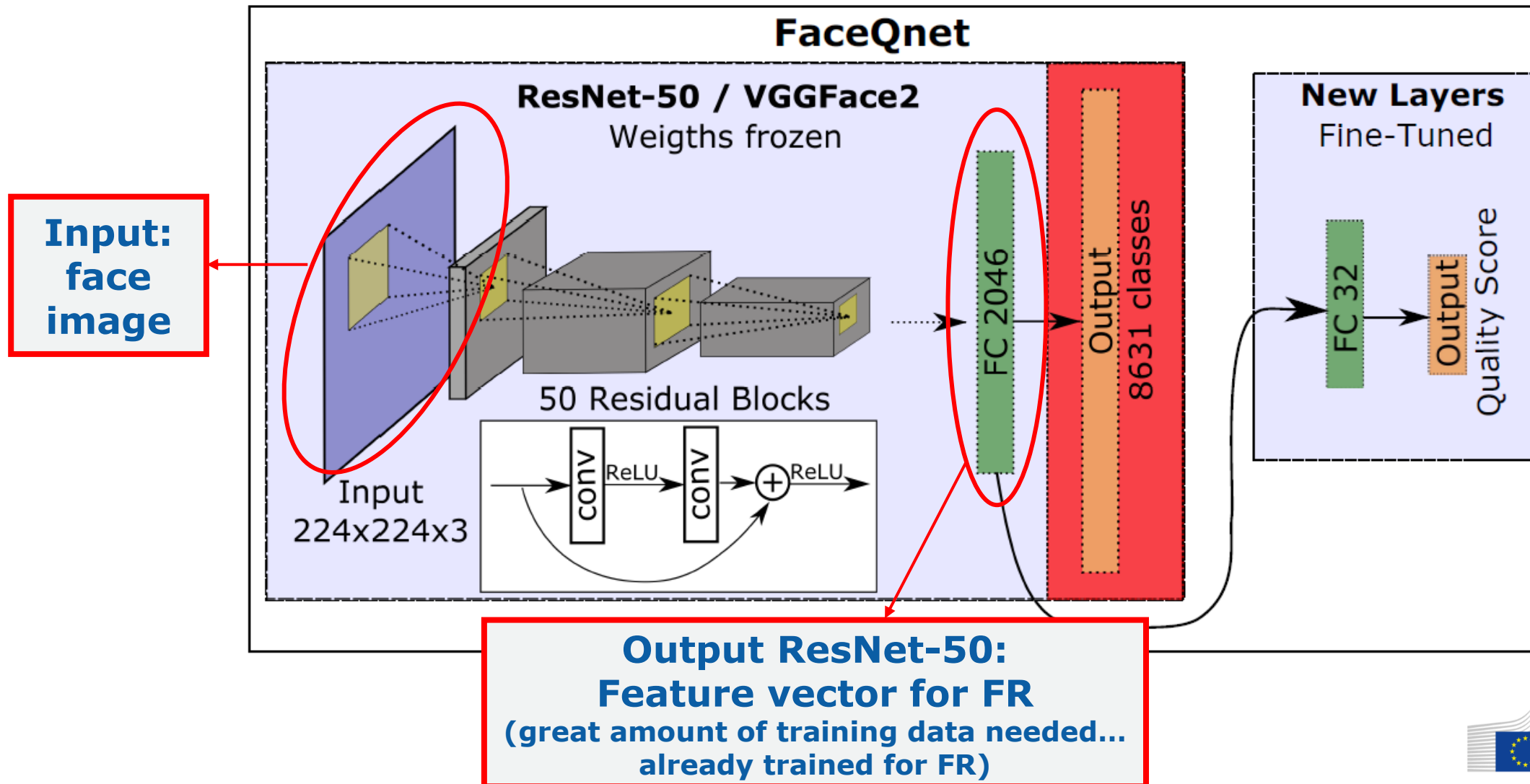




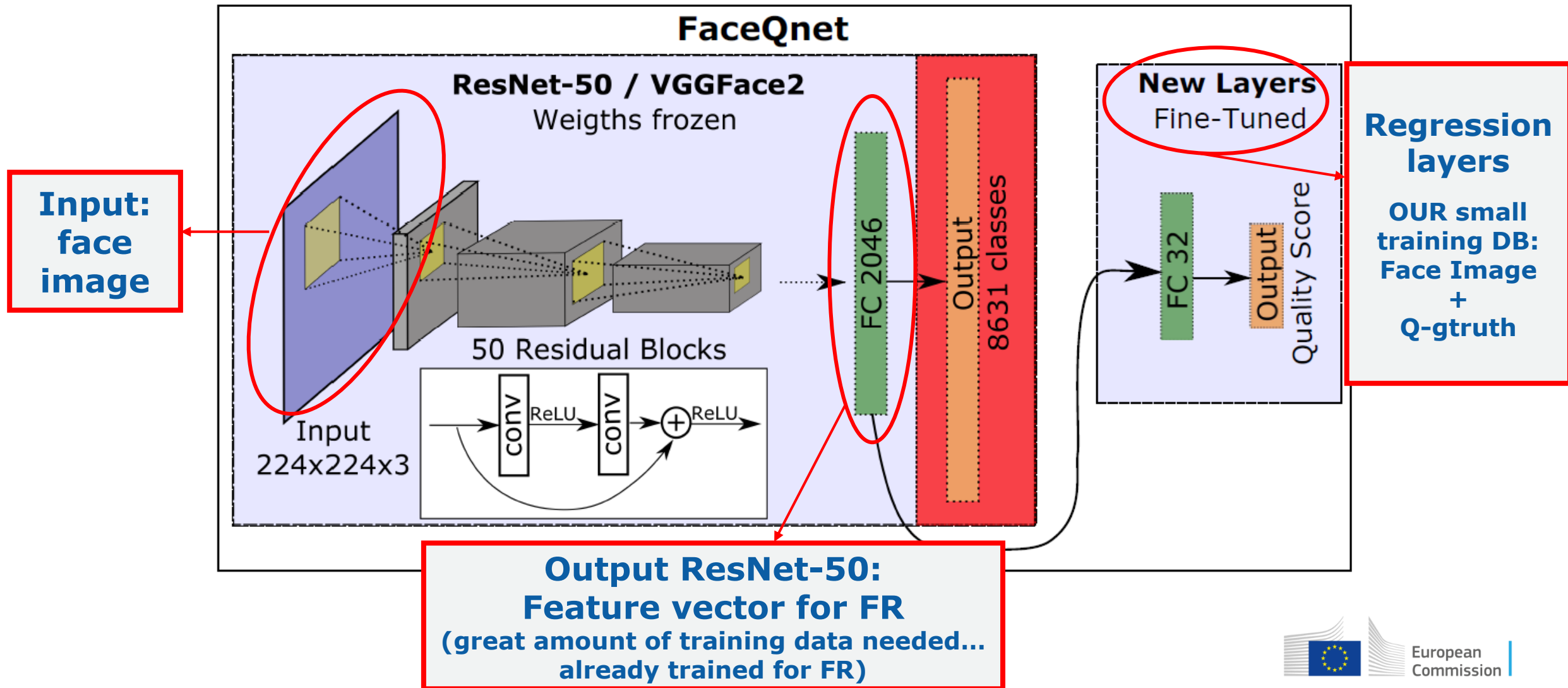
# CHALLENGE 2+3: Our solution



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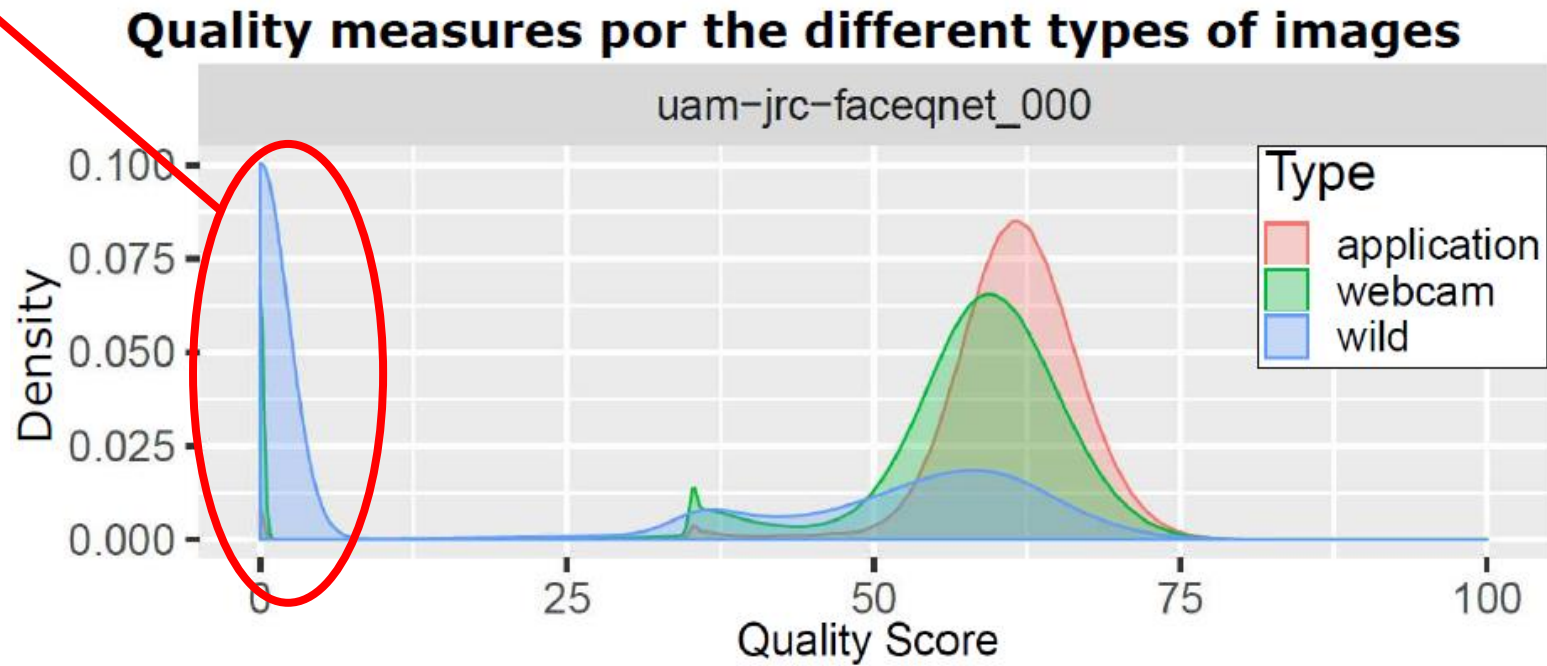


# CHALLENGE 2+3: Our solution



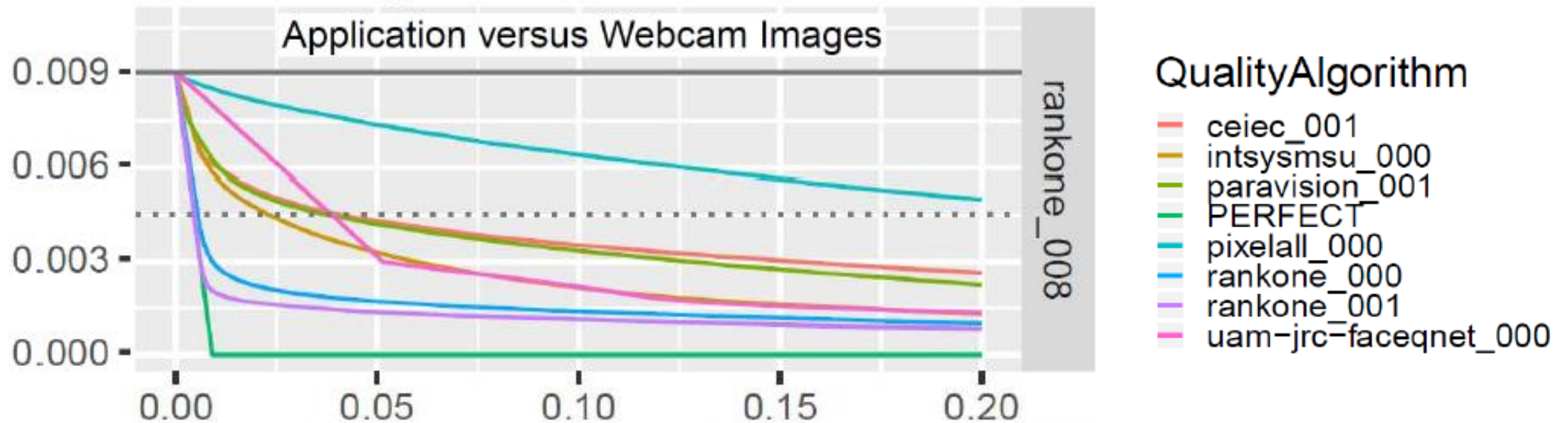
# FaceQnet\_v0 @ NIST FRVT: Initial Results

**Issue**



# FaceQnet\_v0 @ NIST FRVT: Initial Results

## Error vs. Reject Curves



# FaceQnet: What we have

FACE QUALITY: Deep-learning based, machine-produced groundtruth

GOAL: Contribute to ISO/IEC 29794-5 → get to NFIQ2 for face

INDEPENDENTLY ASSESSED: NIST FRVT Ongoing Quality Evaluation

OPEN SOURCE: <https://github.com/uam-biometrics/FaceQnet>

## **FURTHER READING:**

**J. Hernandez-Ortega, J. Galbally, J. Fierrez and L. Beslay,  
"Biometric Quality: Review and Application to Face Recognition with FaceQnet", arXiv:2006.03298 [cs.CV], 2021**

<https://arxiv.org/abs/2006.03298>

# FaceQnet: What we are working on

TRAINING DB: ICAO compliant + other quality

SYSTEM DEPENDENCY: Add more face comparators

LOW QUALITY: Improve discerning low quality images

# Thank you

[javier.galbally@ec.europa.eu](mailto:javier.galbally@ec.europa.eu)



# Keep in touch



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