

# Real-time Motion Capture Facial Animation

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# Overview

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- Introduction
- MoCap Fundamental Science
- Facial MoCap Tracking
- MoCap Facial Animation
- MoCap VR Methods
- Contributions
- Conclusion

# Introduction

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- Main results
- Motivation
- Problem Statement
- Goal
- Framework





# Goal

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Research and develop methods for  
**non-expert users to recognize** facial  
movements **non-intrusively** and **map** them  
to a 3D character **on-the-fly**

# Motivation

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- LIFEisGAME and VERE projects' goal:

Markerless and Real-time Facial Animation of 3D characters using off-the-shelf hardware



# Problem Statement

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Realistic Facial animation  
**labor-intensive & expert dependent**



# Problem Statement

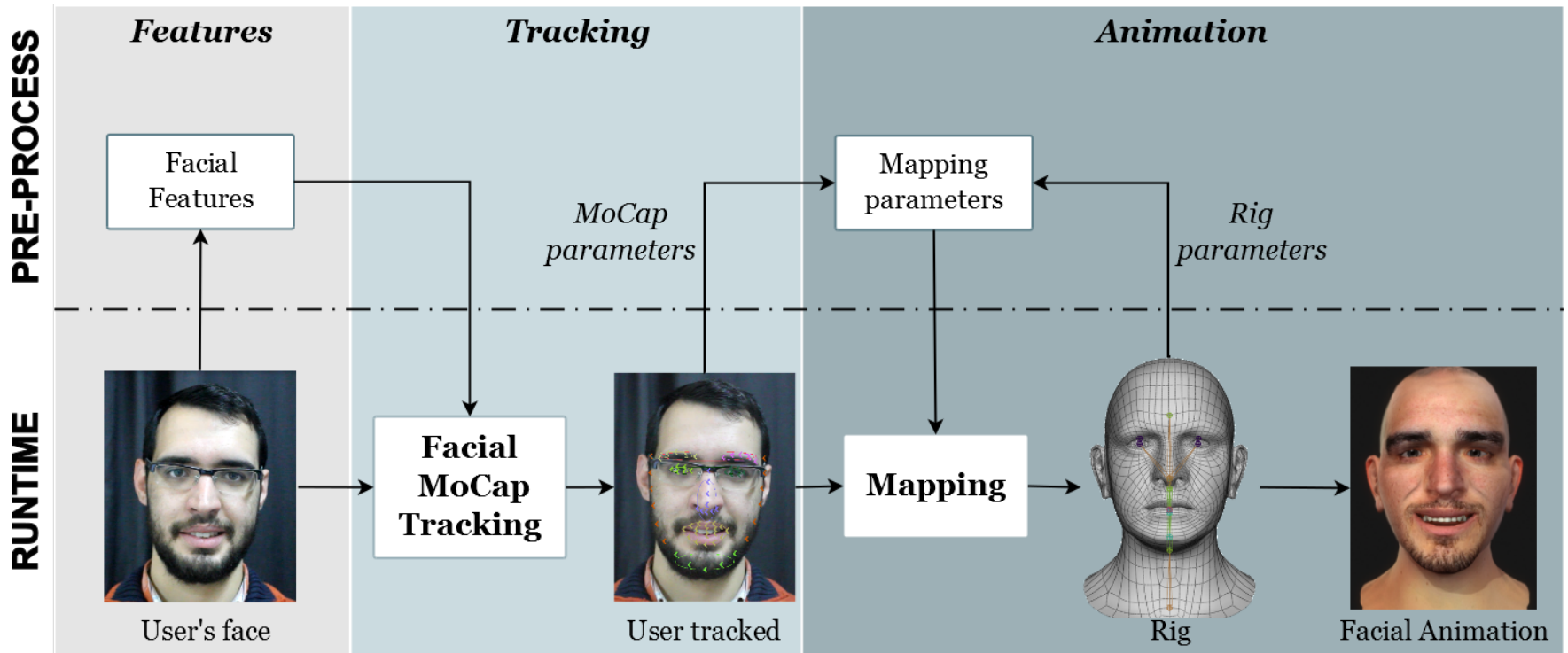
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MoCap Facial animation solutions are  
**not suitable for general user**



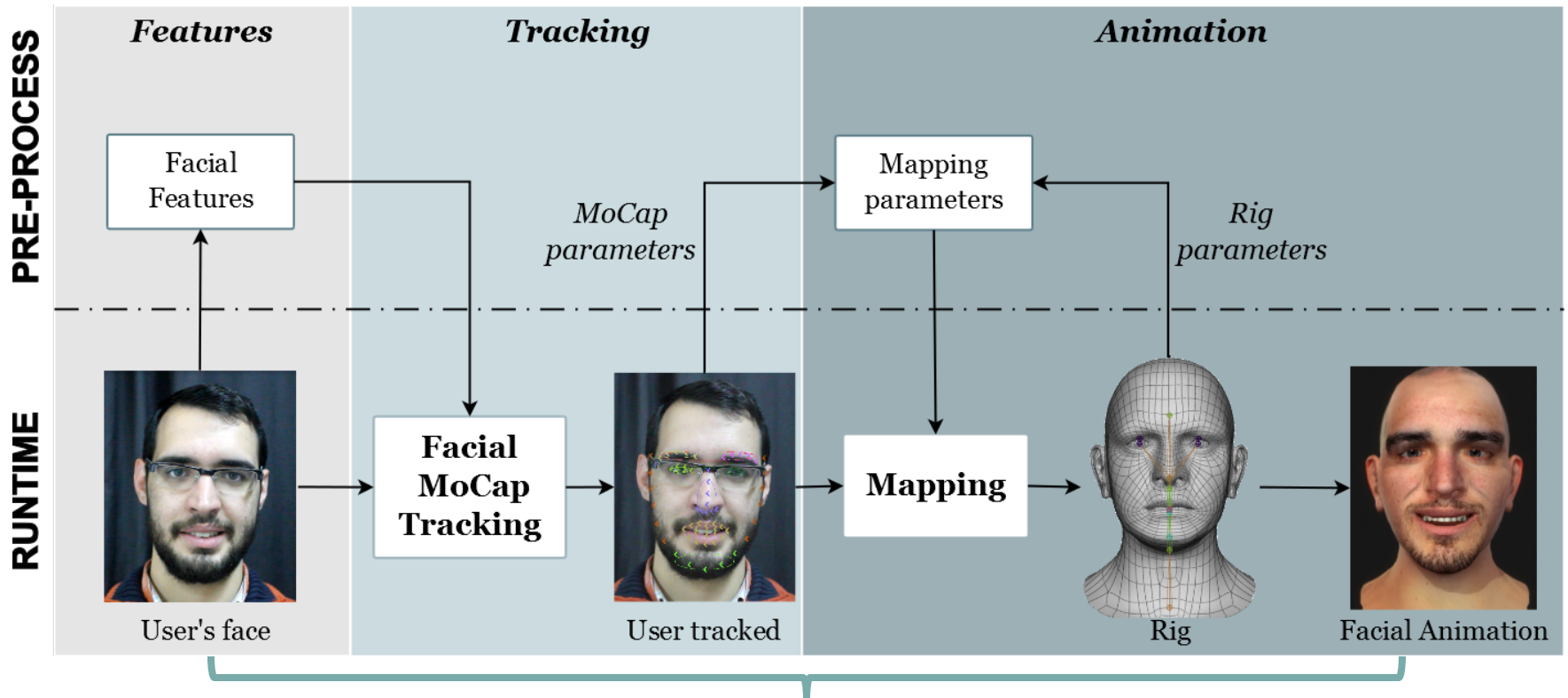
**expensive setups & complex calibrations &  
not compatible to VR environments**

# Framework

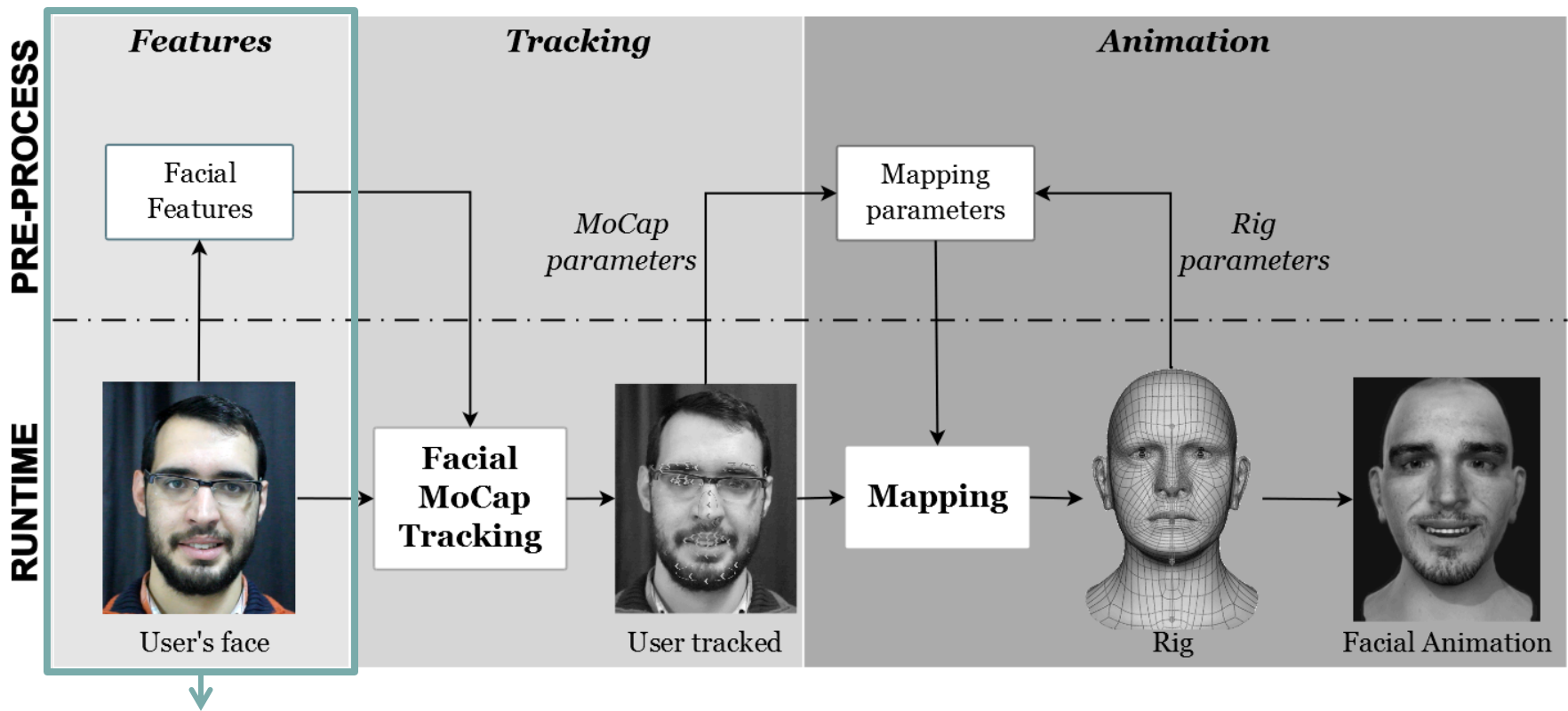




# Framework



**Independent solutions  
for real-time MoCap facial  
animation**



Define **which features** need to be tracked and mapped to 3D character

# MoCap Fundamental Science

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- Face Image Task: Self-perception of Facial Features
- Real-time Emotion Recognition



# Study 1: Face Image Task

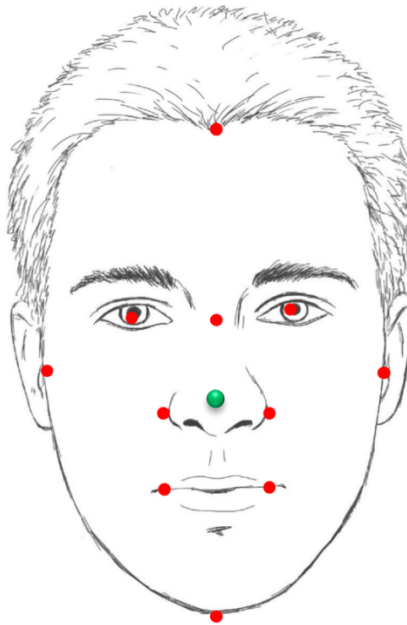
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*To understand how individuals perceive their own facial structure through the evaluation of their knowledge about the position of key facial features*

# Face Image Task: Experiment overview

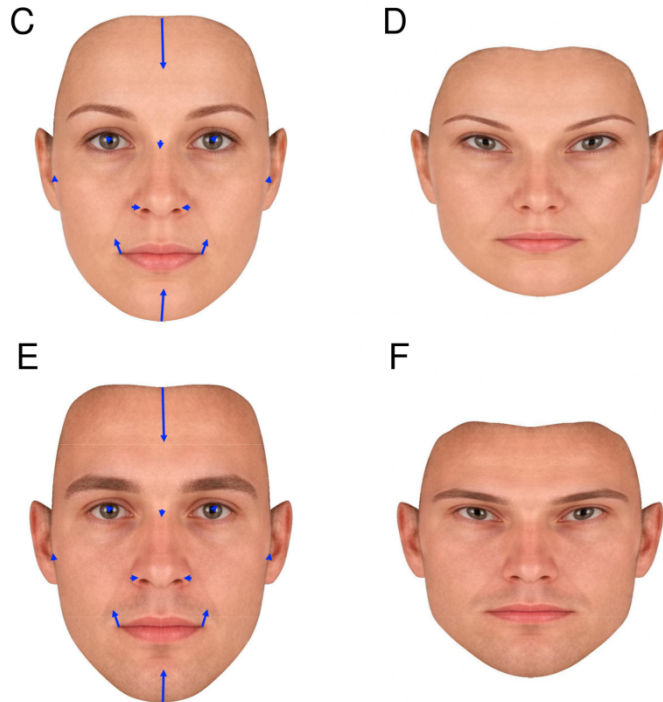
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**50 participants** indicated the location of key features (red) of their own face relative to anchor point (green)



# Face Image Task: Conclusions

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average horizontal (x)  
and vertical (y) error

- Human's spacial **perception** of his own face using 11 key features is **poor**
- High loadings on the upper face accompanied by low loadings of the lower face, or vice versa

**MoCap Tracker**  
**VR MoCap Methods**

Study 2:

## Real-time Emotion Recognition:

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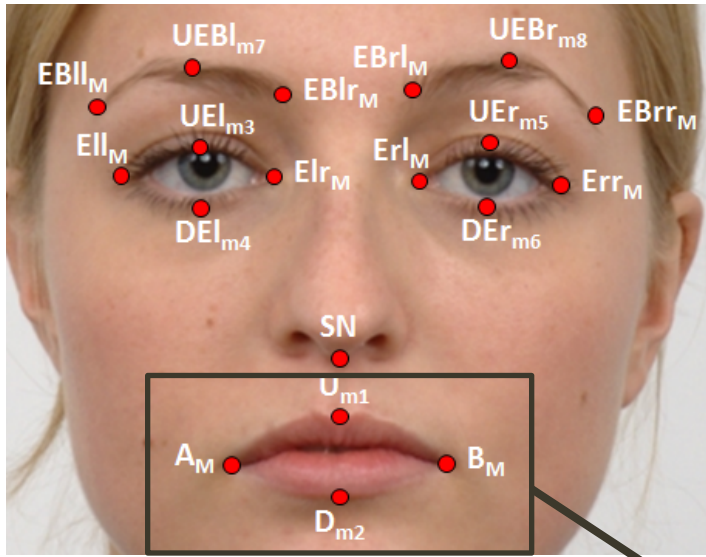
*which facial features characterize the six  
universal emotions*

+

*Real-time geometric features **extraction** and  
emotion **classification***

# Real-time Emotion Recognition

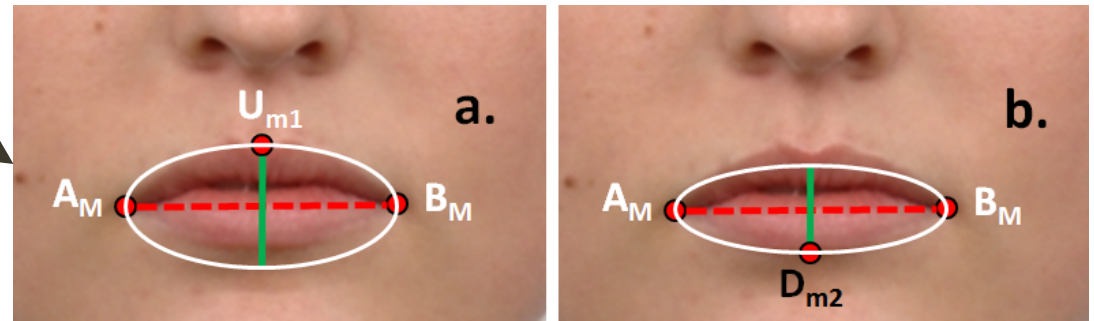
## Geometrical Features Extraction method



### Eccentricity features

$$e = \frac{\sqrt{a^2 - b^2}}{a} \quad \epsilon [0,1]$$

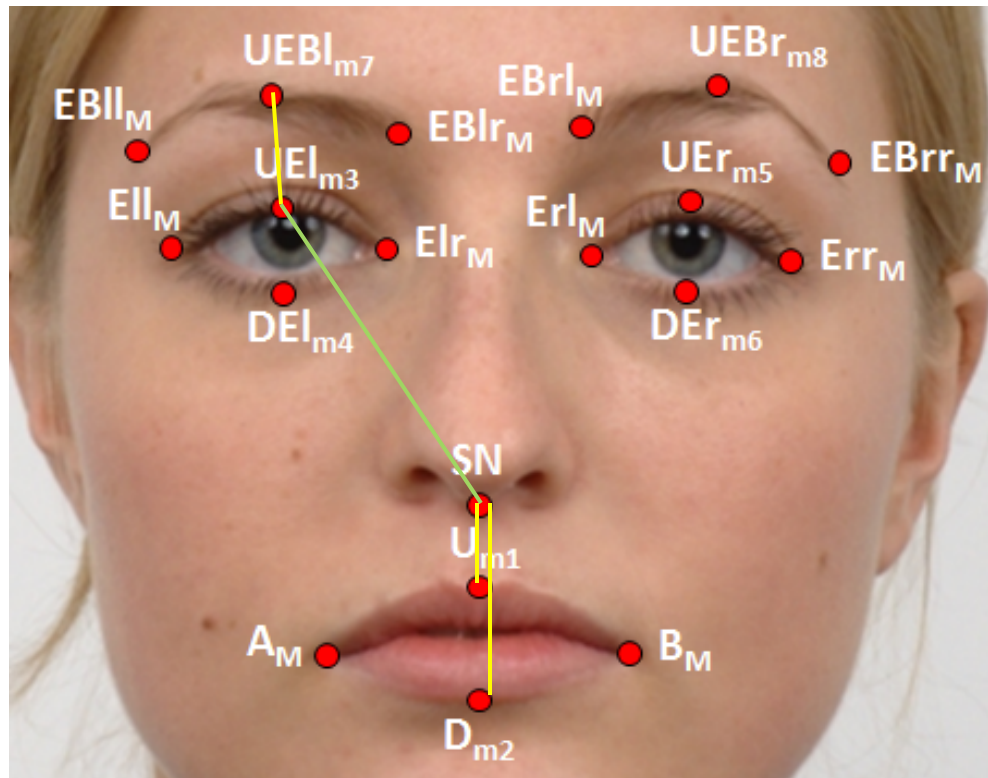
$$a = \frac{B_{Mx} - A_{Mx}}{2} \quad \text{and} \quad b = A_{My} - U_{m1y}$$



# Real-time Emotion Recognition

## Geometrical Features Extraction method

### Linear features



# Real-time Emotion Recognition Results

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Comparison with state of the art methods:

<b>Method</b>	<b>Differential</b>	<b>Accuracy[%]</b>
<i>Michel et al. (Michel and El Kaliouby, 2003)</i>	No	72
<i>Pardàs et al. (Pardàs and Bonafonte, 2002)</i>	No	84
<i>Bartlett et al. (Bartlett et al., 2003)</i>	No	84
<b>Our method S3</b>	No	<b>89</b>
<i>Michel et al. (Michel and El Kaliouby, 2003)</i>	Yes	84
<i>Cohen et al. (Cohen et al., 2003)</i>	Yes	88
<i>Wang et al. (Wang and Yin, 2007)</i>	Yes	93
<b>Our method S5</b>	Yes	<b>94</b>

# Real-time Emotion Recognition

## Conclusions

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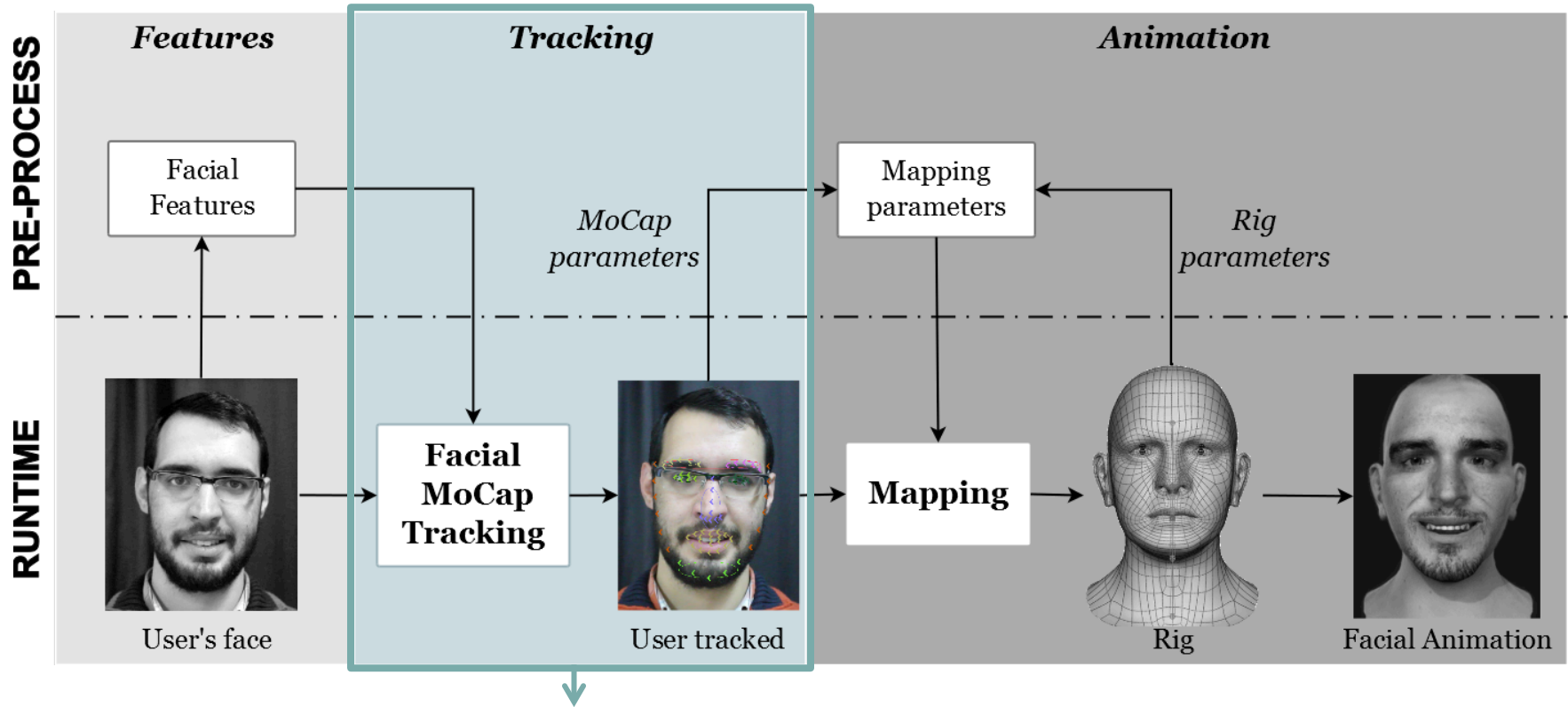
Our geometric method:

- Allows **real-time** feature extraction
- Recognizes 6 universal emotions with **94%** of  
Presents **higher accuracy than state of the art methods**



**VR MoCap Methods**





To **track unique facial features**  
reducing user manual intervention

# Facial MoCap Tracking

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- Background
- Methodology
- Results
- Conclusions

# Background

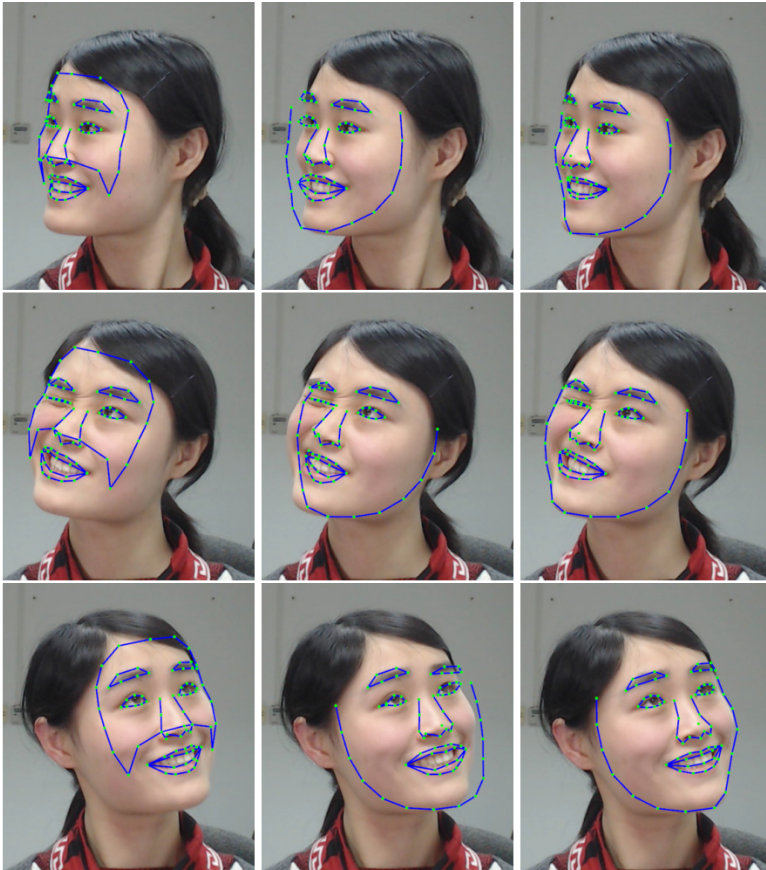
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## Equipment- based

- Intrusive
- Expert dependent
- Time consuming
- Offline fine tuning



# Background



Chen Cao et al. Displaced dynamic expression regression (2014)

## Markerless

- Less intrusive
- Manual and tedious calibrations
- Model fitting in each frame limits facial movements detected
- Locate only semantic facial features like eyes, mouth, nose, etc
- Not compatible with persistent partial occlusions

# Goal

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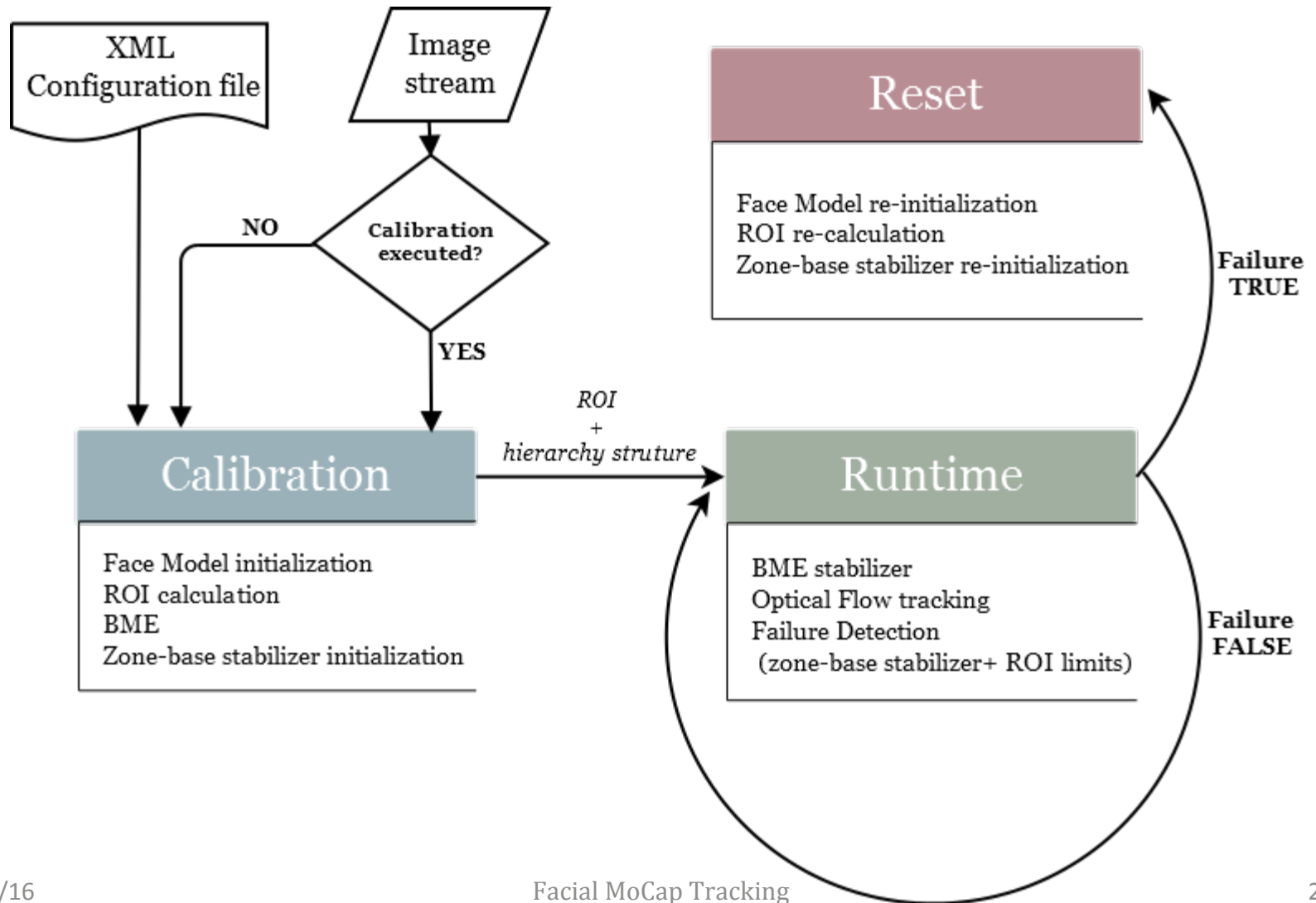
***Markerless tracking of unique facial features movements, such as cheeks or forehead movements and asymmetrical movements, using off-the-shelf hardware.***

# Hypothesis

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To prove that we can use the sensitivity of **Optical Flow** algorithms to track subtle and unique facial movements

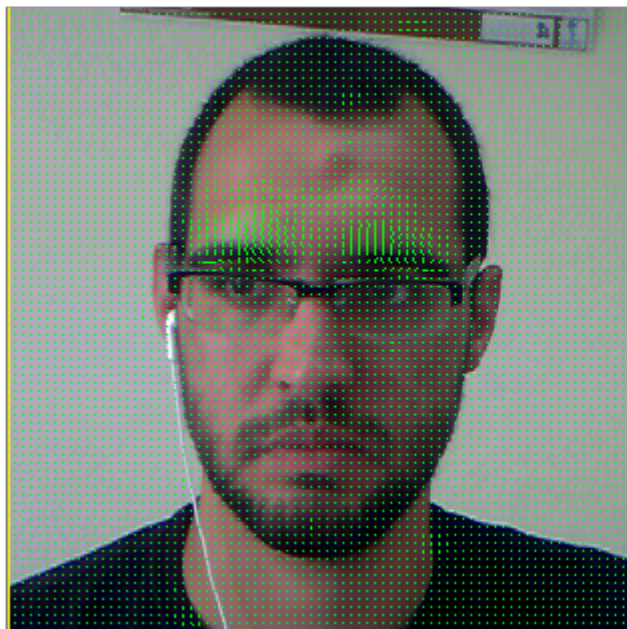
# Method



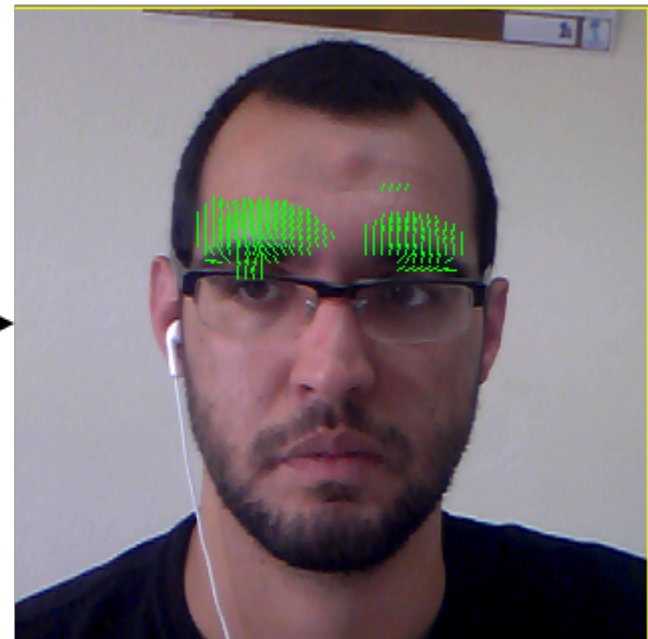
# Calibration: Stabilization methods

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## BME - Baseline Movement Estimation



BME  
filtering

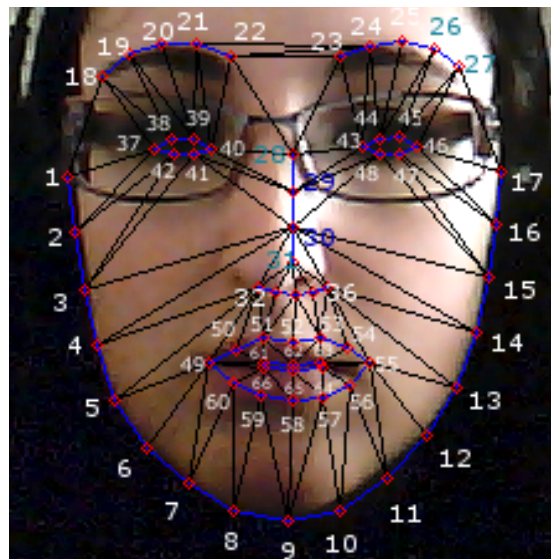




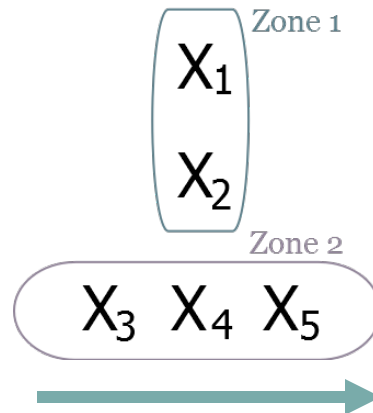
# Calibration: Stabilization methods

## Zone-based stabilization

loads a hierarchy of facial zones and landmarks that define a certain facial model



J.M. Saragih et al. Real-time avatar animation from a single image (2011)

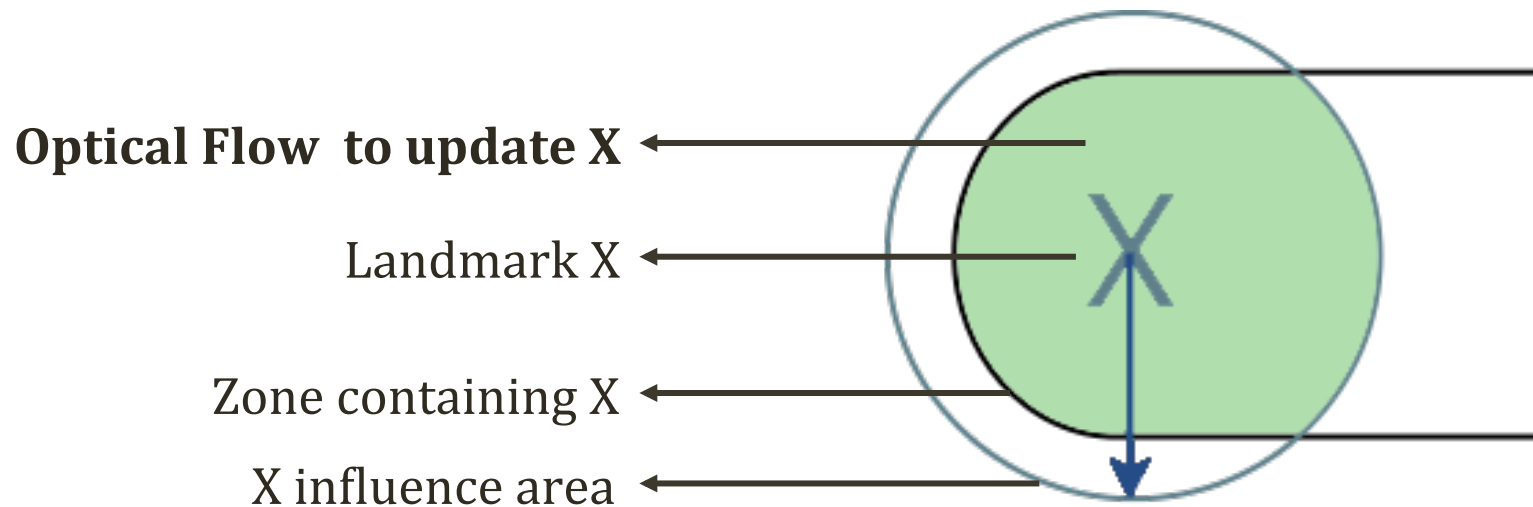


# Runtime Tracking movements

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## 1) Update landmarks:

**Optical Flow + Zone-based stabilization**  
zone limits (black line) and influence ratio (blue ratio)



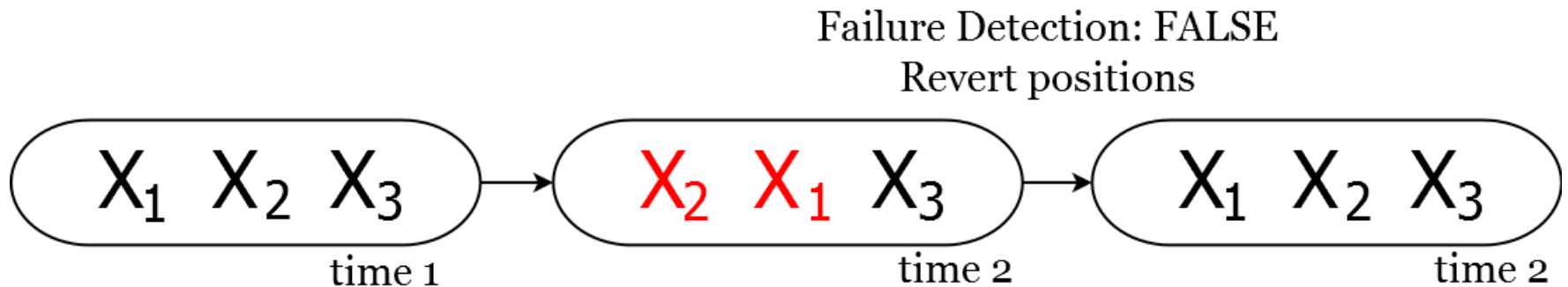
# Runtime

## Zone-based stabilization

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### 2) Failure Check:

Hierarchy **structure is maintained**



# Results

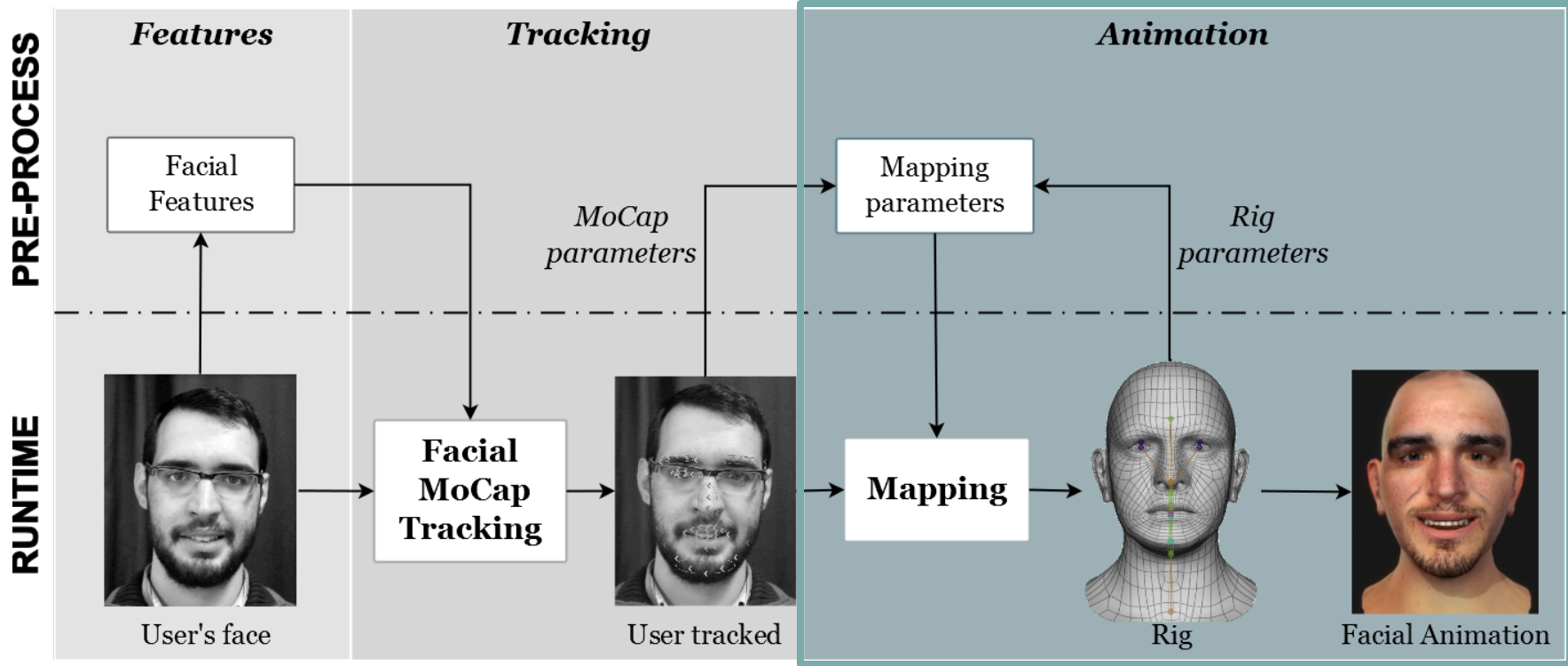
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# Conclusions

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Our method:

- Allows **unsupervised real-time tracking of uncommon facial features**, such as cheek movements
- Performs less accurately than recent SotA methods under extreme environmental changes or during presence of more than one participant



To automatically transfer movements tracked to 3D character creating facial animation

# MoCap Facial Animation

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- Background
- Methodology
- Results
- Conclusions

# Background

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- Example-based algorithms: Digital-Ira

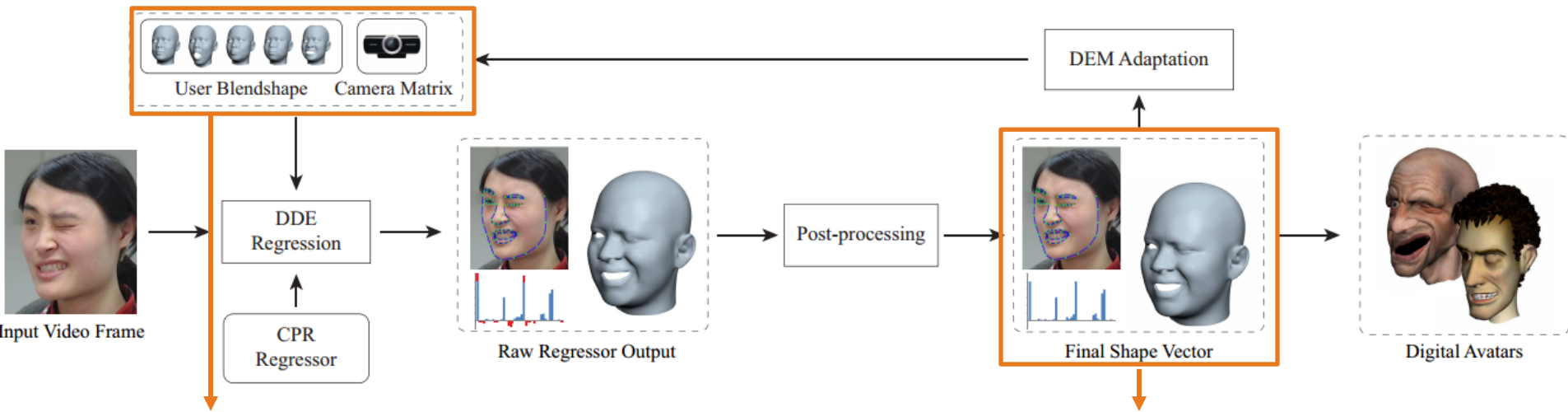


Graham Fyffe et al. Driving High-Resolution Facial Scans with Video Performance Capture (2014)



# Background

- Example-based algorithms:



User-dependent  
long calibrations  
+ Model Learning

Blendshape Rig  
Limited facial expressions

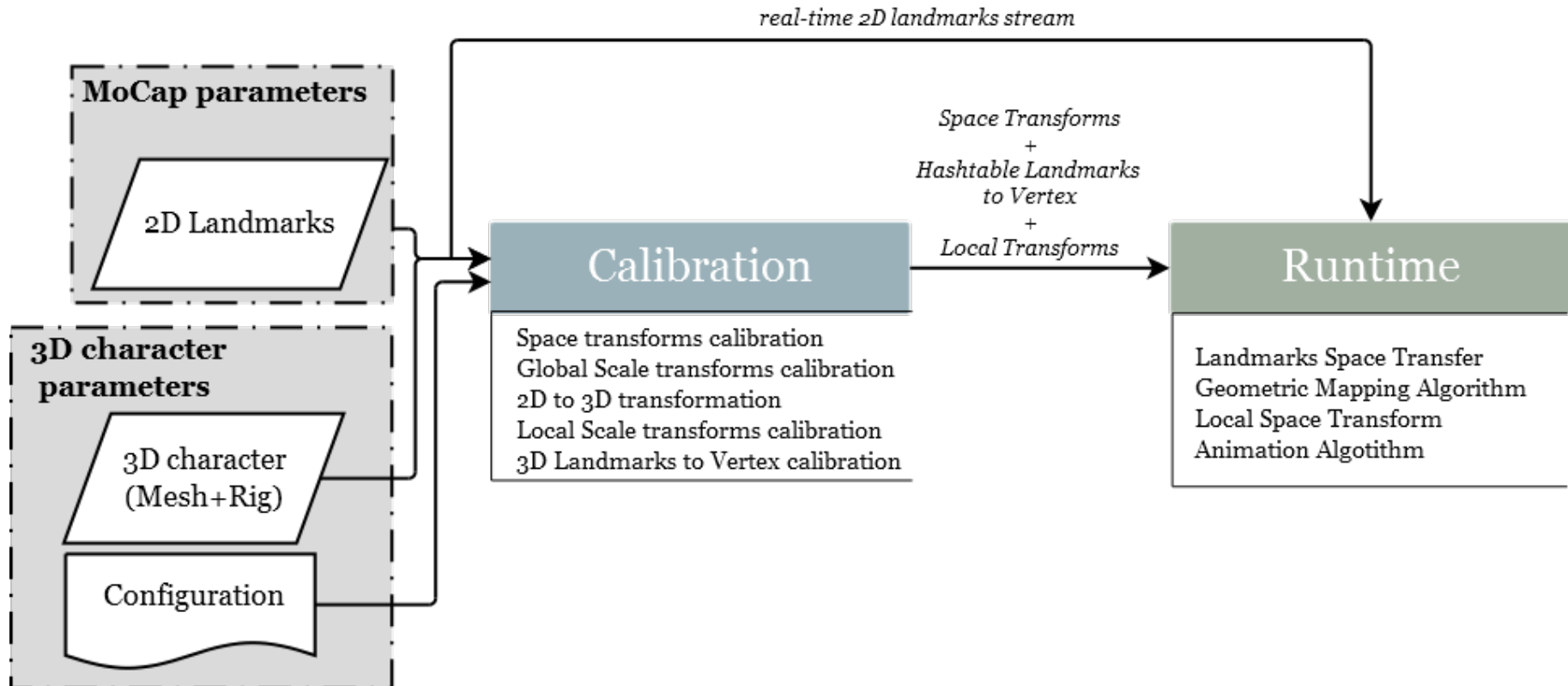
Chen Cao et al. Displaced dynamic expression regression (2014)

# Goal

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*to create a mapping method that **adapts to user-choice MoCap tracking algorithm** and **reduces user-dependent calibration requirements.***

# Mapping method



# Mapping method

## Calibration

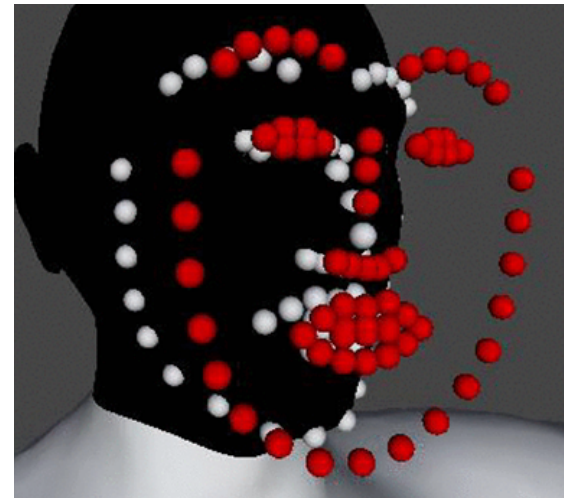
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1) Global + Local Transform between MoCap tracking and 3D character's rig



2D landmarks  
MoCap tracking space

≠ spaces



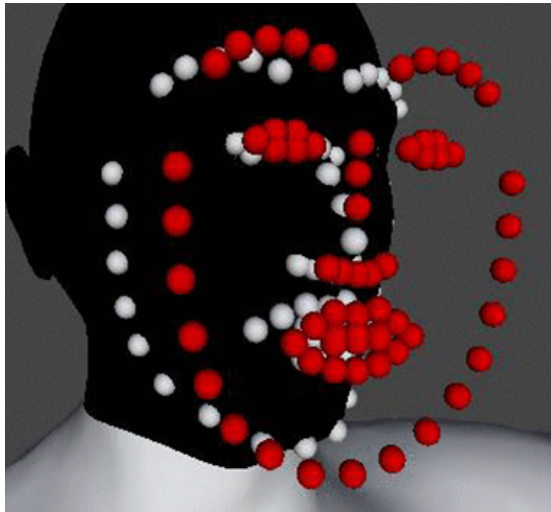
3D landmarks  
3D character's space

# Mapping method

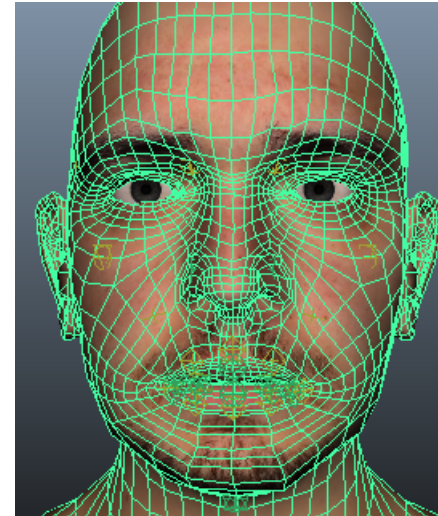
## Calibration

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2) Hashtable with connection between 3D landmarks and vertex in the 3D character's mesh



3D landmarks  
3D character's space



Vertex in the Mesh  
3D character's space

# Mapping method

## Runtime

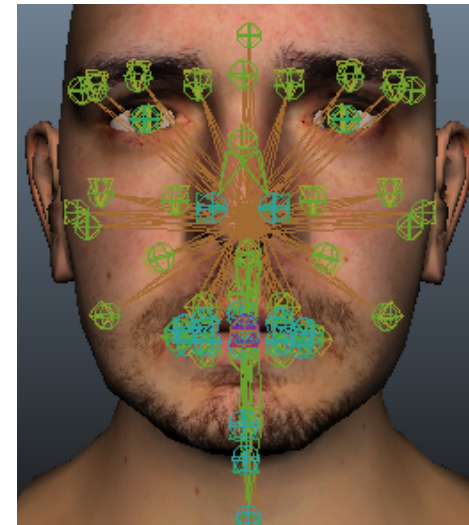
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- + Apply Global and Local **transform**
- + **Geometric Mapping** between vertex and bones
- + calculate intensity of bone's movements **to create animation**



2D landmarks  
MoCap tracking space

≠ topology  
→



Rig's bones  
3D character's space

# Mapping method

## Runtime: Geometric Mapping

correspondence between vertex (in the mesh) and the **bones** in the 3D character's rig.

To each vertex:

1) Main-bone translation:

$$\begin{array}{l} \text{2D} \\ \text{Main - bone} \\ \text{translation} \end{array} \boxed{B_{Mxyz}} = \frac{\begin{array}{l} \text{associated Landmark} \\ \text{Movement} \\ L_{xyz} - L_{ixyz} \end{array}}{\boxed{W_{main}}} + \boxed{B_{iMxyz}} \begin{array}{l} \text{Main - bone} \\ \text{Initial position} \end{array}$$

**Sum of Weights  
of bone and childs**

# Mapping method

## Runtime: Geometric Mapping

correspondence between vertex (in the mesh) and the bones in the 3D character's rig.

To each vertex:

1) Main-bone translation:

$$B_{Mxyz} = \frac{L_{xyz} - Li_{xyz}}{W_{main}} + Bi_{Mxyz}$$

2) Secondary bones translation:

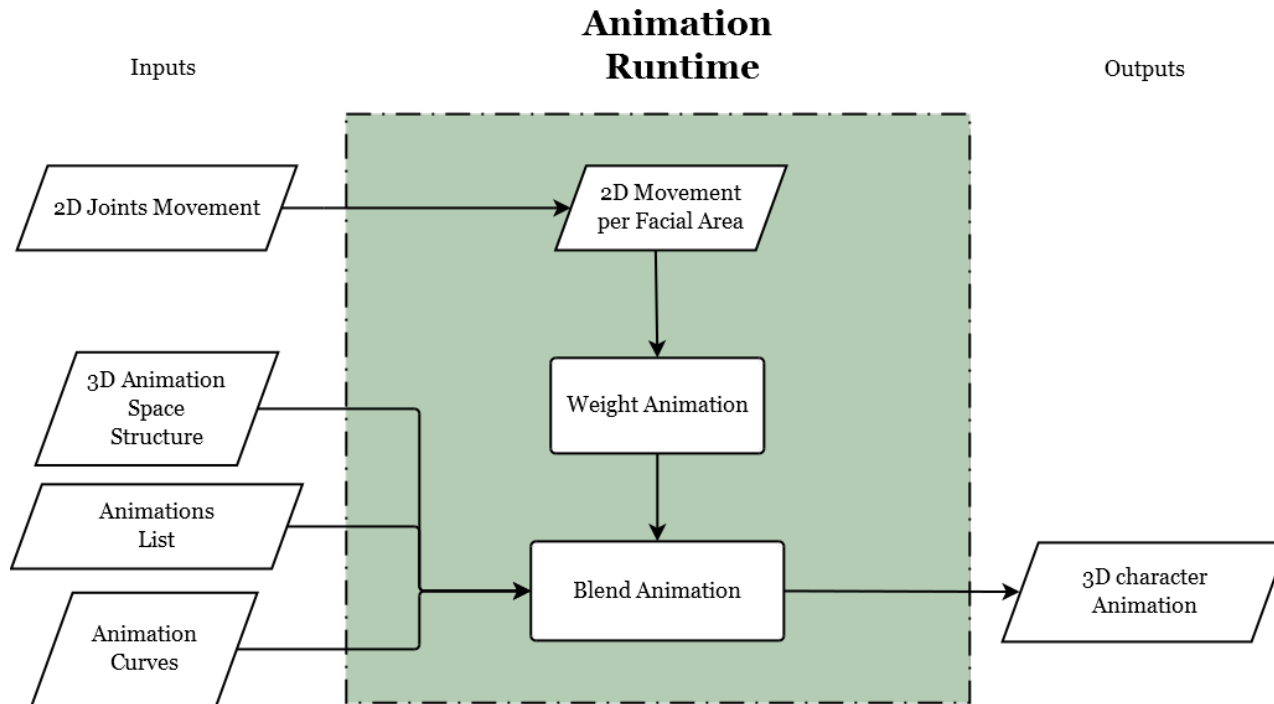
$$\begin{array}{c} \text{2D} \\ \text{Sec - bone} \\ \text{translation} \end{array} \quad B_{sec-xyz} = \begin{array}{c} \text{Bone translation} \\ (B_{Mxyz} - Bi_{Mxyz}) \end{array} * \begin{array}{c} \text{Sum of weights of Bsec} \\ \text{and childs} \\ W_{sec} \end{array} + \begin{array}{c} \text{Sec - bone initial} \\ \text{translation} \\ Bi_{sec-xyz} \end{array}$$



# Mapping method

## Runtime: Animation

calculates the **intensity of deformation** produced by the translation of each bone.

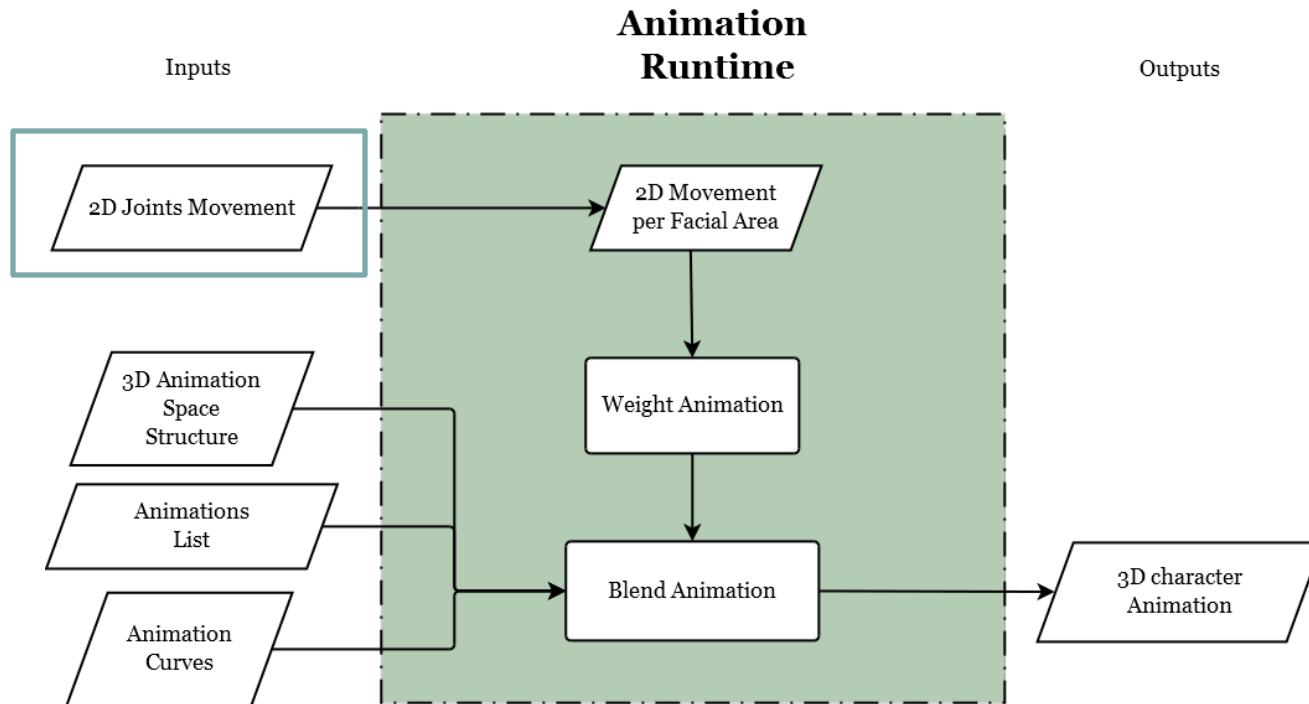


# Mapping method

## Runtime: Animation

calculates the **intensity of deformation** produced by the translation of each bone.

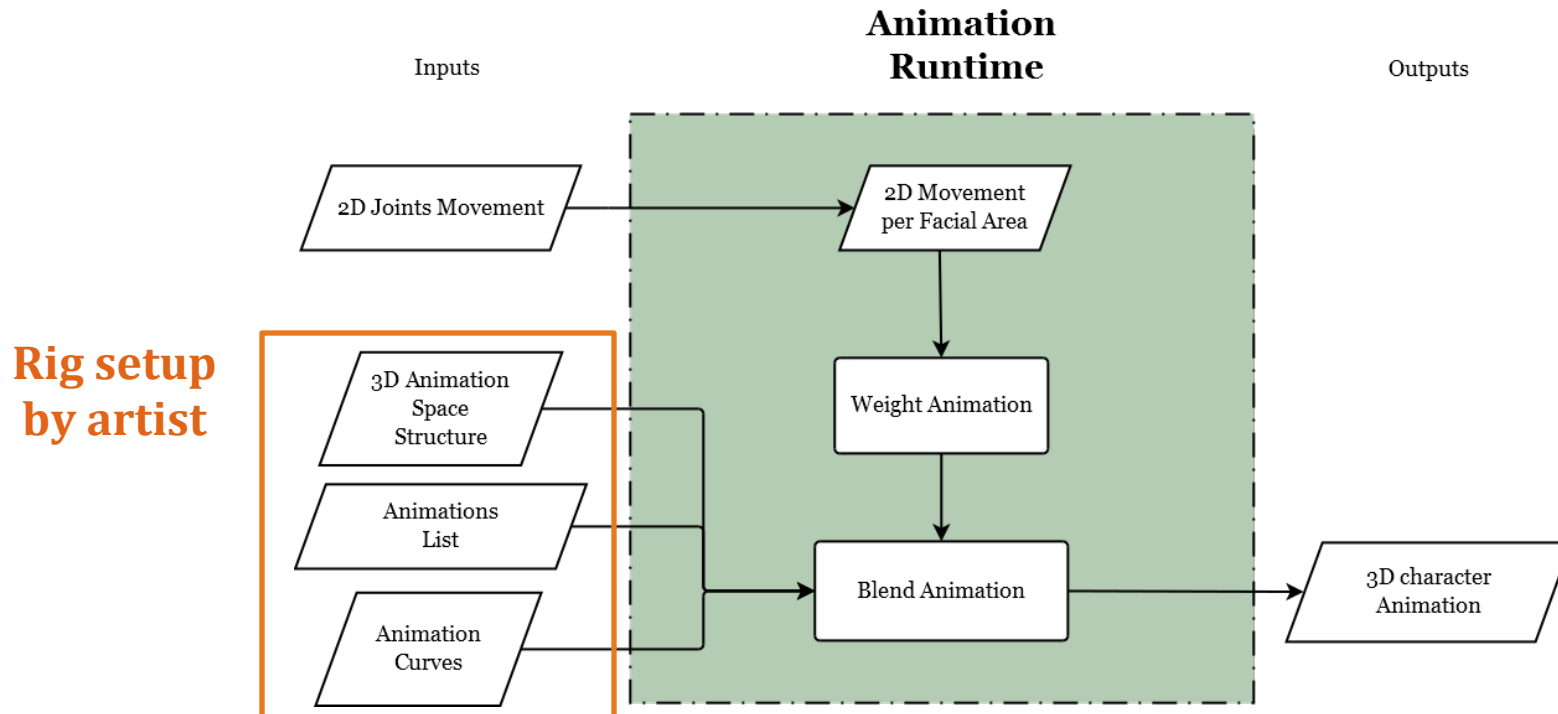
Output:  
Geometric  
mapping



# Mapping method

## Runtime: Animation

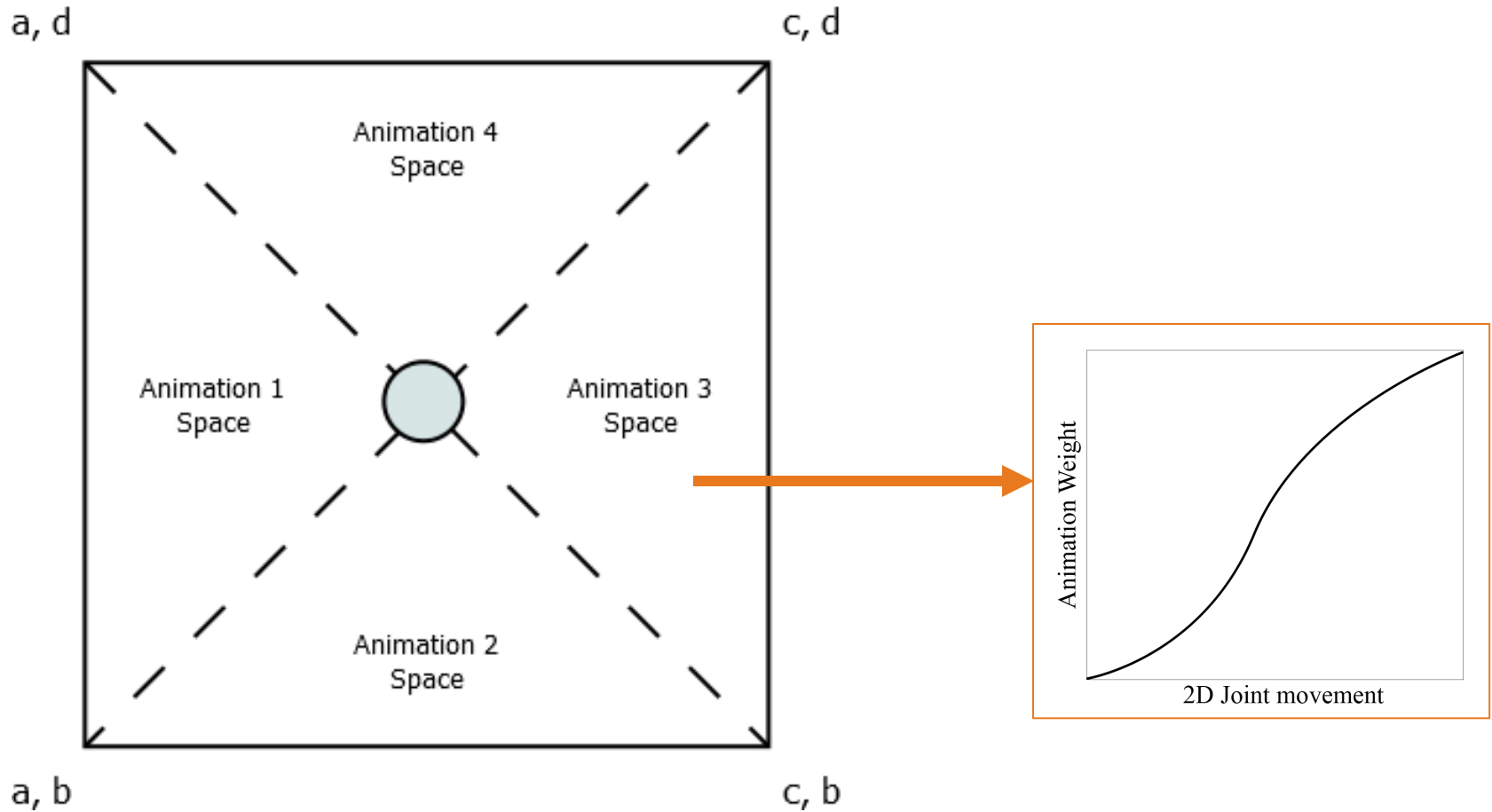
calculates the **intensity of deformation** produced by the translation of each bone.



# Mapping method

## Runtime: Animation

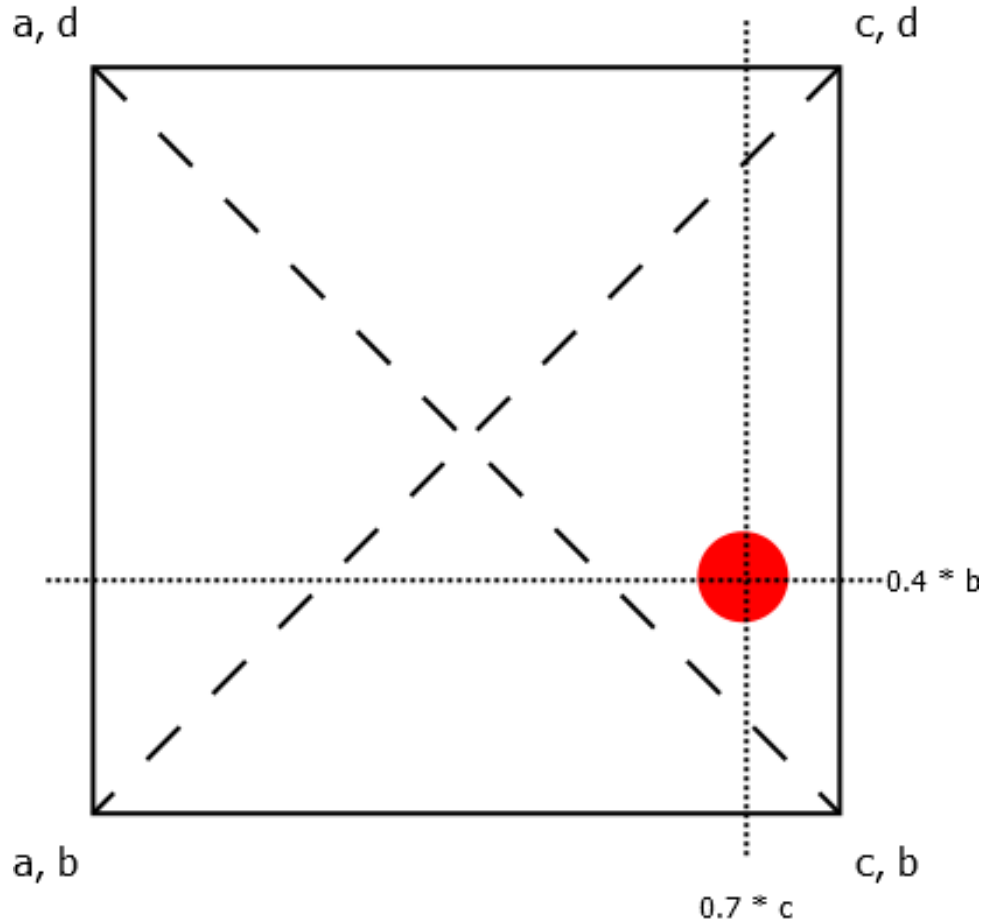
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# Mapping method

## Runtime: Animation

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**Bone Animation =**  
Animation 2 with weight  $0.4 * b$   
Animation 3 with weight  $0.7 * c$

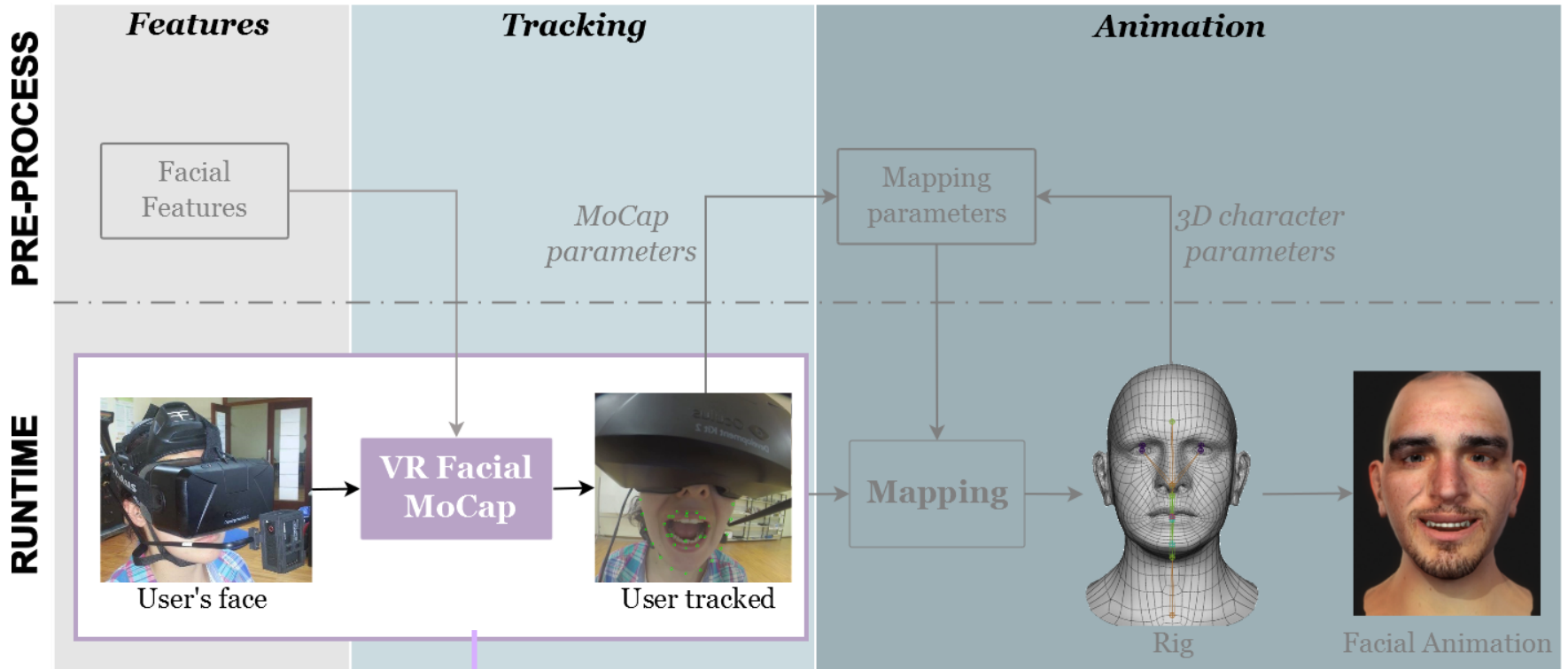
MoCap  
Real-time Facial Animation  
Test Case 1  
Real-time MoCap Tracker

# Conclusions

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Geometric mapping algorithm:

- Adapts to **different MoCap tracking** systems
- Allow **real-time animation** without complex calibrations
- Reproduces **asymmetrical facial movements**



To create **MoCap tracking** systems compatible with **VR** environments



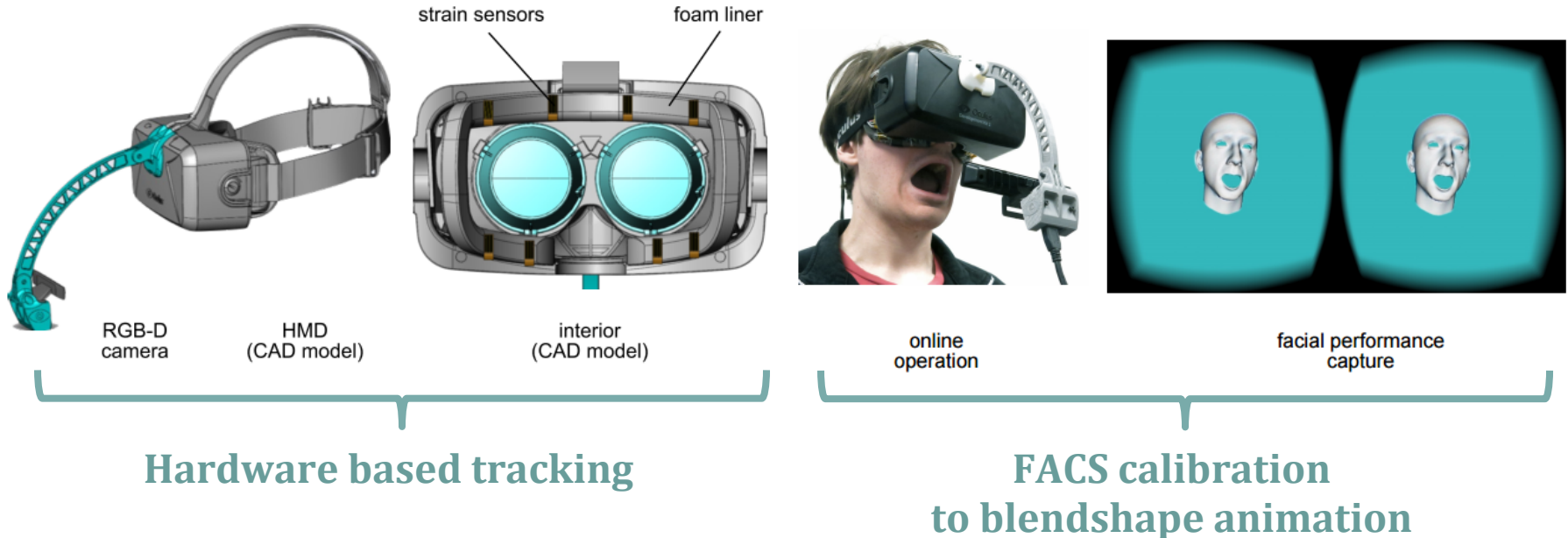
# MoCap VR Methods

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- Background
- Methodology
- Results
- Conclusions

# Background

- **VR scenario:** Persistent partial occlusions



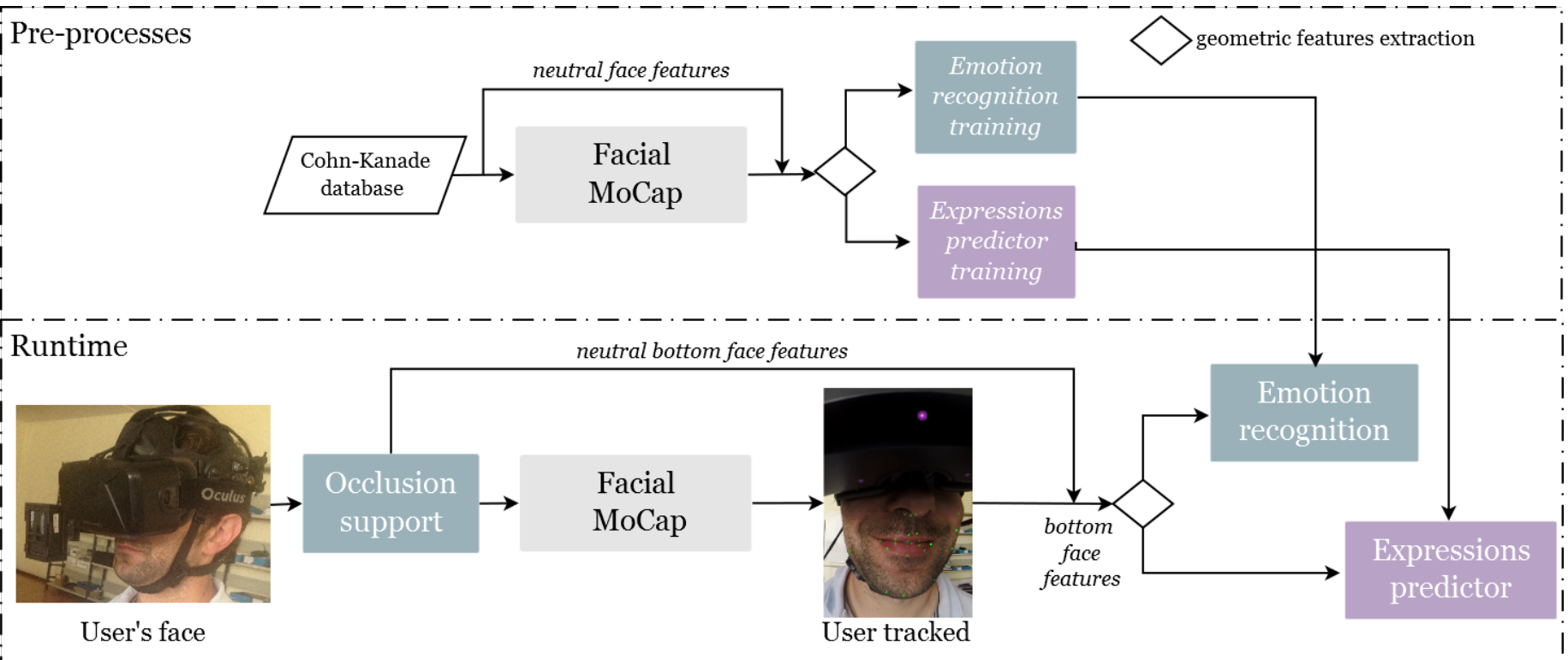
Hao Li et al, Facial performance sensing head-mounted display (2015)

# Goal

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*to create methods to **estimate facial expressions** of upper part of the face and **predicts emotions** using movements tracked from bottom of the face.*

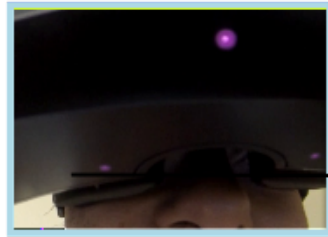
# MoCap VR methods



# MoCap VR methods

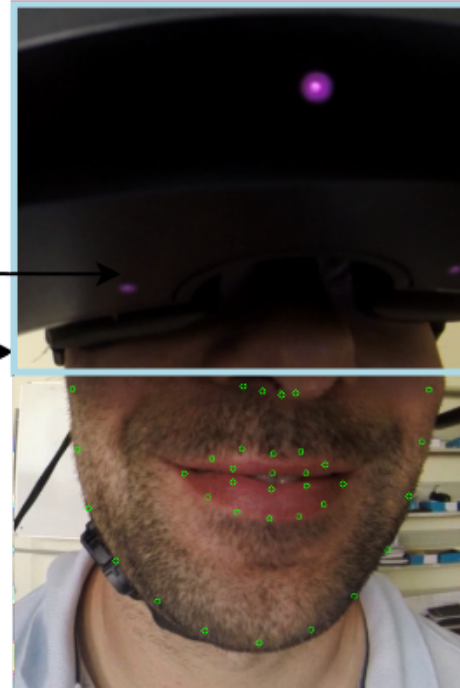
## Persistent Partial Occlusions

Calibration



Our method

Our Result

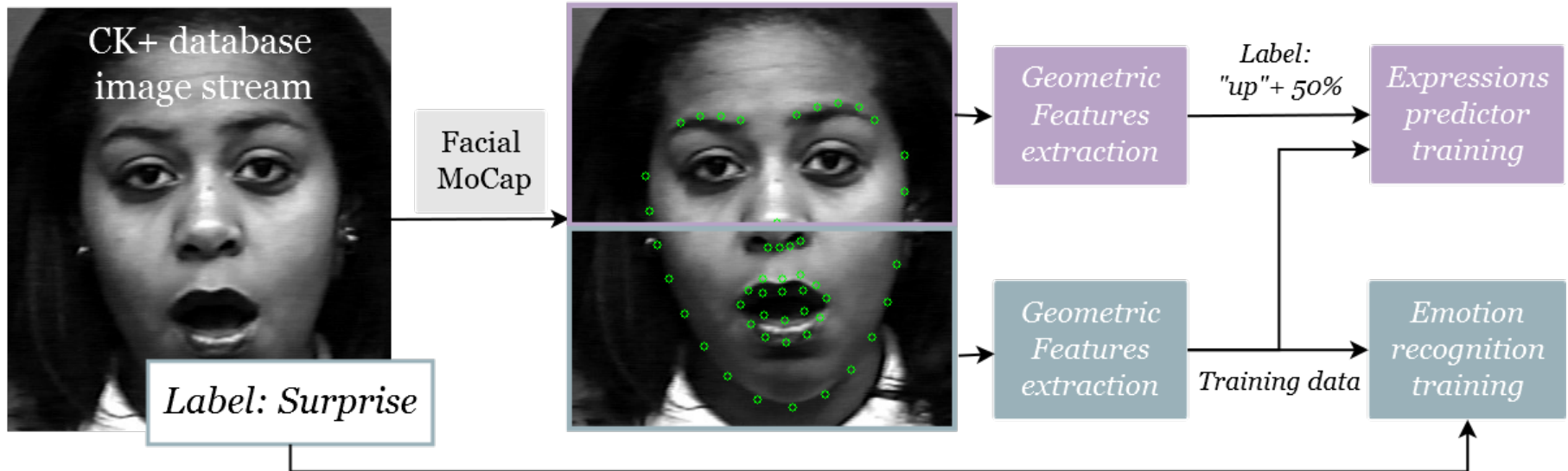


Real image



# MoCap VR methods

## Assessing Facial Expressions



Geometric features extraction:

$$D(p_i, p_c) = \sqrt{\frac{((p_i(x) - p_c(x))^2 + (p_i(y) - p_c(y))^2)}{\|p_i - p_c\|}}$$

# Statistical Validation

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Emotions	K-Fold Accuracy (%)
six [EF78]	64.80
four [JJ13]	69.07

Eyebrows movements	K-Fold Accuracy(%)
Up <i>S1</i>	91.47
Up <i>S2</i>	87.02
Down <i>S1</i>	70.63
Down <i>S2</i>	69.13

# Statistical Validation

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# VR MoCap Tracking

# Conclusions

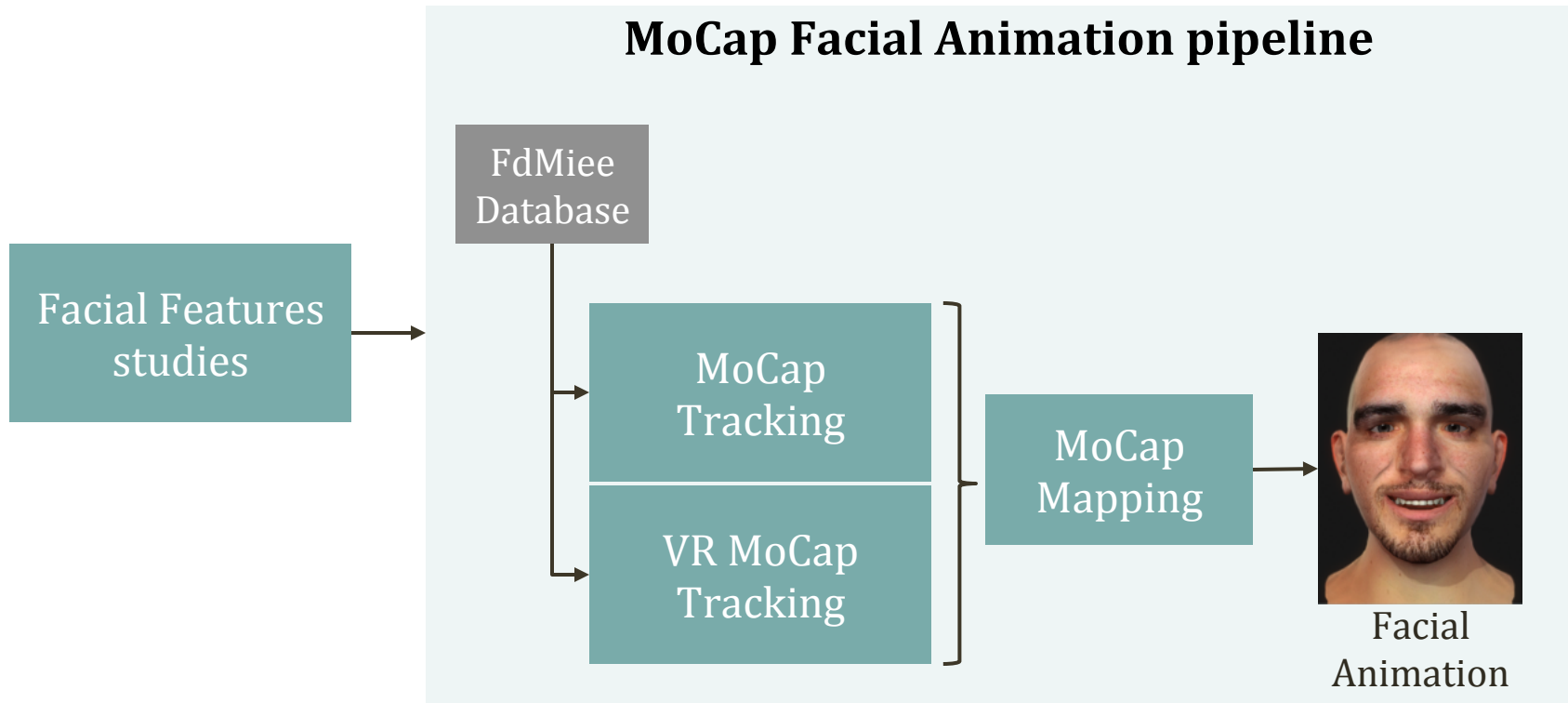
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MoCap VR methods:

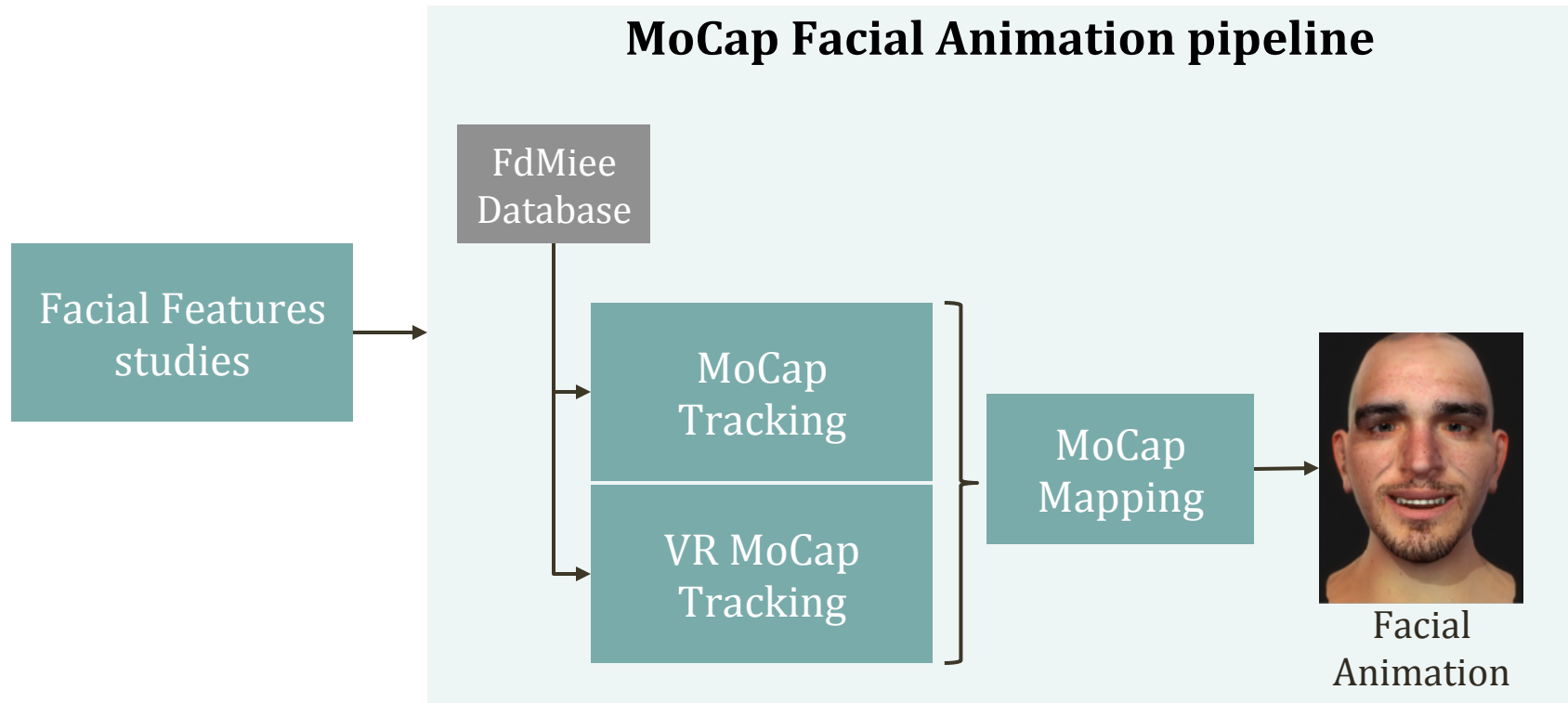
- Make generic MoCap tracker systems **compatible with persistent partial occlusions** in VR environments
- **Predict six universal emotions**
- **Estimate eyebrows' movements**

# Contributions

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# Contributions



- Real-time**
- Modular**
- Non-intrusive**
- Reduce manual intervention**
- Usable by non-experts**
- Off-the-shelf hardware**

# Dissemination

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- 2 articles accepted
- 3 articles submitted
- 1 Eurographics course submitted
- 2 best idea/concept Award
- 1 EU Project Workshop
- 5 invited talks

# Conclusion

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Facial Features  
studies

**F**ace perception  
**F**acial behaviors  
**P**sychology  
of emotions

MoCap  
tracking

MoCap  
Mapping

VR MoCap  
Tracking

# Conclusion

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Facial Features  
studies

**F**ace perception  
**F**acial behaviors  
**P**sychology  
of emotions

MoCap  
tracking

**O**F to track unique  
facial traits  
**B**iometrics  
**S**ecurity

MoCap  
Mapping

VR MoCap  
Tracking

# Conclusion

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## Facial Features studies

- F**ace perception
- F**acial behaviors
- P**sychology of emotions

## MoCap tracking

- O**F to track unique facial traits
- B**iometrics
- S**ecurity

## MoCap Mapping

- A**daptive animation algorithms
- U**ser friendly applications

## VR MoCap Tracking



# Conclusion

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## Facial Features studies

- F**ace perception
- F**acial behaviors
- P**sychology of emotions

## MoCap tracking

- O**F to track unique facial traits
- B**iometrics
- S**ecurity

## MoCap Mapping

- A**daptive animation algorithms
- U**ser friendly applications

## VR MoCap Tracking

- V**R tracking of emotions and facial expressions
- H**ardware free approach
- L**earning algorithms for expressions prediction

# Take-home message

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Facial Animation created  
by **anyone** for **everyone!**

**Thank you!**

# FdMiee's protocol

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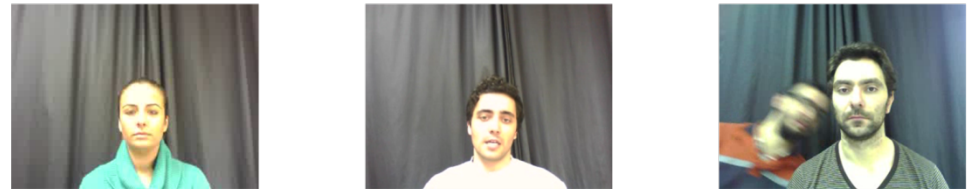
Protocol to create facial databases under a wide range of environment and behavior changes

FdMiee database:

- 6 participants
- 3 capture systems
- 6 Fixed Parameters



A. HD Camera



B. Webcam



B. IR Camera