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# **Ego-Motion Compensated Face Detection on a Mobile Device**

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# Outline

- Motivation
- Boosting Based Face Detection
- Inertial Measurement Unit
- Proposed Method
- Experimental Results
- Conclusion





P.Viola and M.Jones. Rapid object detection using a boosted cascade of simple features. CVPR, 2001





- well known appearance-based approach
- utilizes Adaboost in the classifier training
  - weak classifiers based on Haar-like features
- integral image for efficient feature computation
- standard in current commercial cameras



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- utilizes Adaboost in the classifier training
  - weak classifiers based on Haar-like features
- integral image for efficient feature computation
- standard in current commercial cameras
- pros:
  - general object detection framework
  - good detection rates
  - fast detection
- drawbacks:
  - slow training
  - highly rotational variant



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Rotation invariant detection based on Viola and Jones?

- Du et al.: set of rotated Haar like features
- Wu et al.: divide human faces according to different view points

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Inertial sensors getting major attention

- markerless human motion capturing
- structure from motion

• ...

Inertial sensors are available on most current mobile devices

- mobile phones (iPhone, HTC Desire, ...)
- iPod touch, iPad, ...



Viola and Jones face detection framework (rotational variant)





Viola and Jones face detection framework (rotational variant)



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mobile devices with an IMU (inertial measurement unit)



Viola and Jones face detection framework (rotational variant) mobile devices with an IMU (inertial measurement unit)

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Adaboost is an algorithm for constructing a ,,strong" classifier as a linear combination of simple ,,weak" classifiers  $h_t(x)$ :

$$f(x) = \sum_{t=1}^{T} \alpha_t h_t(x)$$

final "strong" classifier/hypothesis: H(x) = sign(f(x))



### **Haar-like Features**

- Easy computation (scalable and changeable in size and position)
- Fast and efficient computation with integral-image

$$I_{\Sigma}(x,y) = \sum_{i=0}^{i \le x} \sum_{j=0}^{j \le y} I(i,j)$$



$$A + D - (C + B)$$





### Example







### **Inertial Measurement Unit**



iPhone 4, 4G iPod Touch, iPad 2



# two hardware sources: • three axis accelerometer

• three axis gyroscope



![](_page_19_Picture_7.jpeg)

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World-coordinate System (defined by the IMU)

spanned by the axes:  $(x_{\text{world}}, y_{\text{world}}, z_{\text{world}})$ 

 $z_{\text{world}} := -\frac{a_{\text{gravitation}}}{||a_{\text{gravitation}}||}$ 

 $x_{\text{world}}, y_{\text{world}}$  defined orthogonal to gravity (right-hand space)

![](_page_20_Picture_5.jpeg)

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Apple provides a proprietary algorithm to calculate absolute orientations relative to the static world-coordinate system.

![](_page_21_Picture_6.jpeg)

![](_page_21_Picture_7.jpeg)

Camera-coordinate system:

We are interested in the rotation around the z-axis (yaw-angle)

![](_page_22_Figure_3.jpeg)

![](_page_22_Figure_4.jpeg)

![](_page_22_Picture_5.jpeg)

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![](_page_23_Picture_1.jpeg)

![](_page_23_Picture_2.jpeg)

tnt

![](_page_23_Picture_4.jpeg)

Apples proprietary algorithm gives:

$$(0, i_{\text{device},t}) = q(0, i_{\text{world}})q^{-1} \quad (i \in \mathbb{R}^3)$$

![](_page_24_Picture_3.jpeg)

![](_page_24_Picture_4.jpeg)

![](_page_24_Picture_5.jpeg)

![](_page_24_Picture_6.jpeg)

tnt

![](_page_24_Picture_8.jpeg)

Apples proprietary algorithm gives:

 $(0, i_{\text{device},t}) = q(0, i_{\text{world}})q^{-1} \quad (i \in \mathbb{R}^3)$ 

project  $z_{\text{world}}$  on the devices screen surface:

 $z_{\text{proj},t} = z_{\text{world}} - \langle z_{\text{world}} | z_{\text{device},t} \rangle \cdot z_{\text{device},t}$ 

![](_page_25_Picture_5.jpeg)

![](_page_25_Picture_6.jpeg)

![](_page_25_Picture_7.jpeg)

![](_page_25_Picture_8.jpeg)

![](_page_25_Picture_10.jpeg)

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compute the yaw-angle:

$$\cos(\varphi_{\text{yaw}}) = \pm \langle y_{\text{device},t} | z_{\text{proj},t} / | | z_{\text{proj},t} | | \rangle$$

having the yaw-angle, we rotate the camera image to produce a virtual upright image

![](_page_26_Picture_8.jpeg)

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![](_page_26_Picture_10.jpeg)

![](_page_26_Picture_11.jpeg)

![](_page_26_Picture_12.jpeg)

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![](_page_27_Figure_1.jpeg)

![](_page_27_Picture_2.jpeg)

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![](_page_28_Figure_1.jpeg)

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![](_page_29_Figure_1.jpeg)

![](_page_29_Picture_2.jpeg)

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![](_page_30_Picture_1.jpeg)

![](_page_30_Picture_3.jpeg)

![](_page_31_Picture_1.jpeg)

![](_page_31_Picture_2.jpeg)

![](_page_31_Picture_3.jpeg)

![](_page_32_Picture_1.jpeg)

![](_page_32_Picture_3.jpeg)

![](_page_33_Picture_1.jpeg)

![](_page_33_Picture_2.jpeg)

![](_page_33_Picture_3.jpeg)

	CAMERA	FACE	SYMBOLIC
Sequence 1	straight	straight	
Sequence 2	straight	rotated	
Sequence 3	rotated	straight	

![](_page_34_Picture_4.jpeg)

	CAMERA	FACE	SYMBOLIC	
Sequence 1	straight	straight		
Sequence 2	straight	rotated		
Sequence 3	rotated	straight		

![](_page_35_Picture_2.jpeg)

		CAMERA	FACE	SYMBOLIC	
Sequ	ence 1	straight	straight		
Sequ	ence 2	straight	rotated		0
Sequ	ence 3	rotated	straight		0

![](_page_36_Picture_2.jpeg)

![](_page_36_Picture_3.jpeg)

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![](_page_36_Picture_4.jpeg)

![](_page_37_Picture_1.jpeg)

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eibniz

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# Thanks for your attention!!!

![](_page_43_Picture_8.jpeg)