



MAHASARAKHAM  
UNIVERSITY

# INTRODUCTION TO MACHINE LEARNING

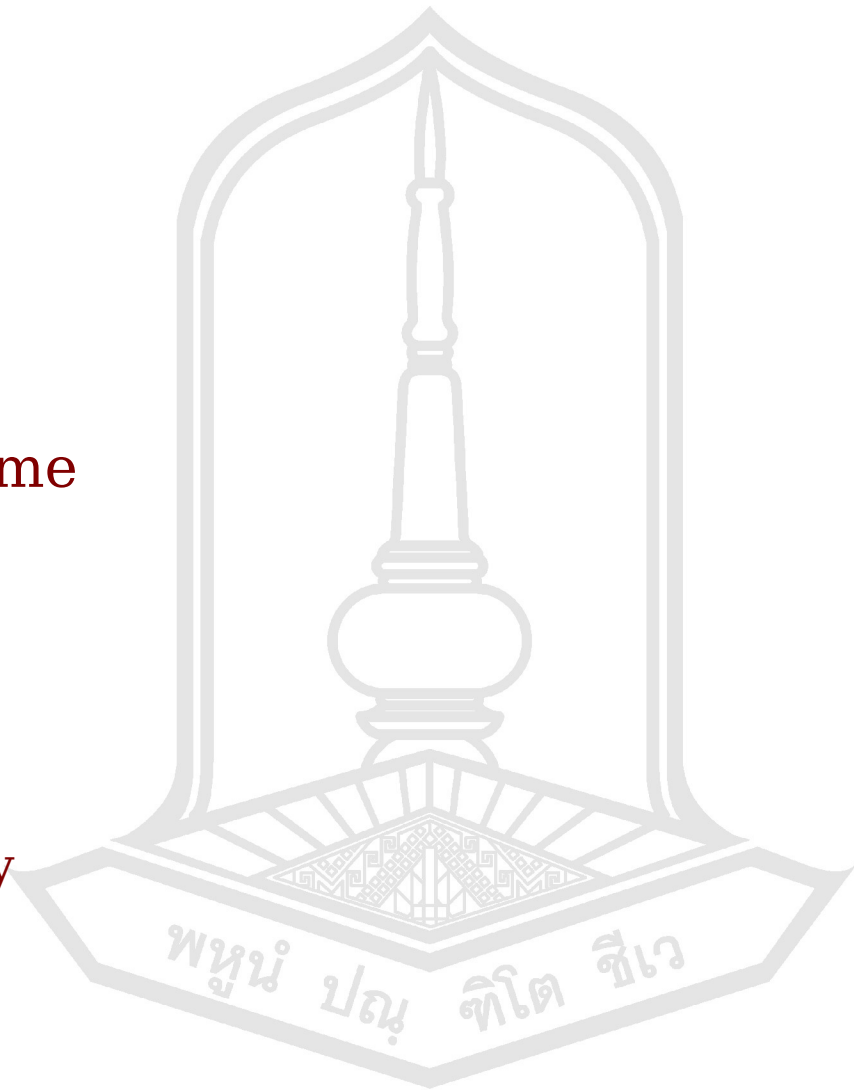
For Computer Animation and Game

17 September 2019

# INTRODUCTION TO MACHINE LEARNING

For Computer Animation and Game

Olarik Surinta, PhD.  
Department of Information Technology  
Faculty of Informatics  
Mahasarakham University





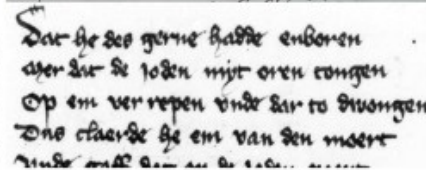
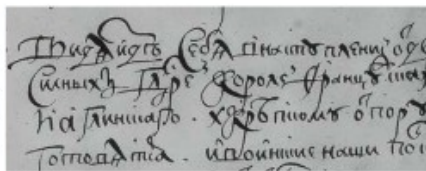
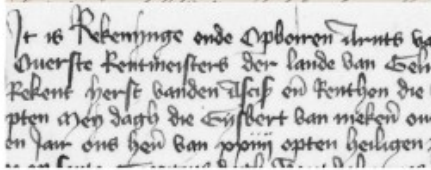
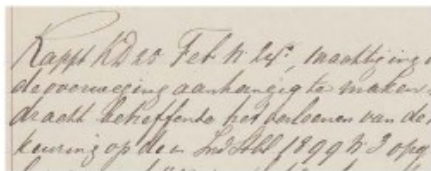
- โอฟาริก สุรินทร์

ภาควิชาเทคโนโลยีสารสนเทศ

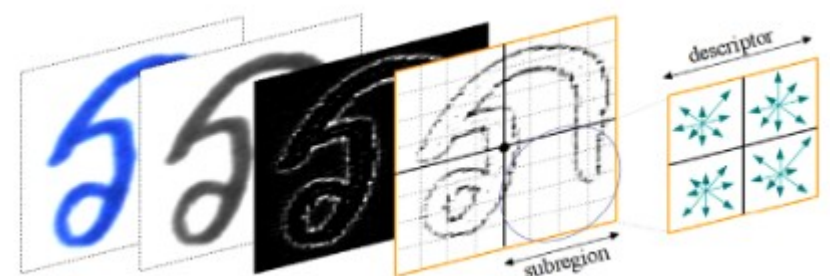
- Multi-agent Intelligent Simulation Laboratory (MISL)

- Research Area

Image Processing, Computer Vision, Machine Learning  
Pattern Recognition, Object Detection, Deep Learning  
Historical Document Analysis



Historical Document



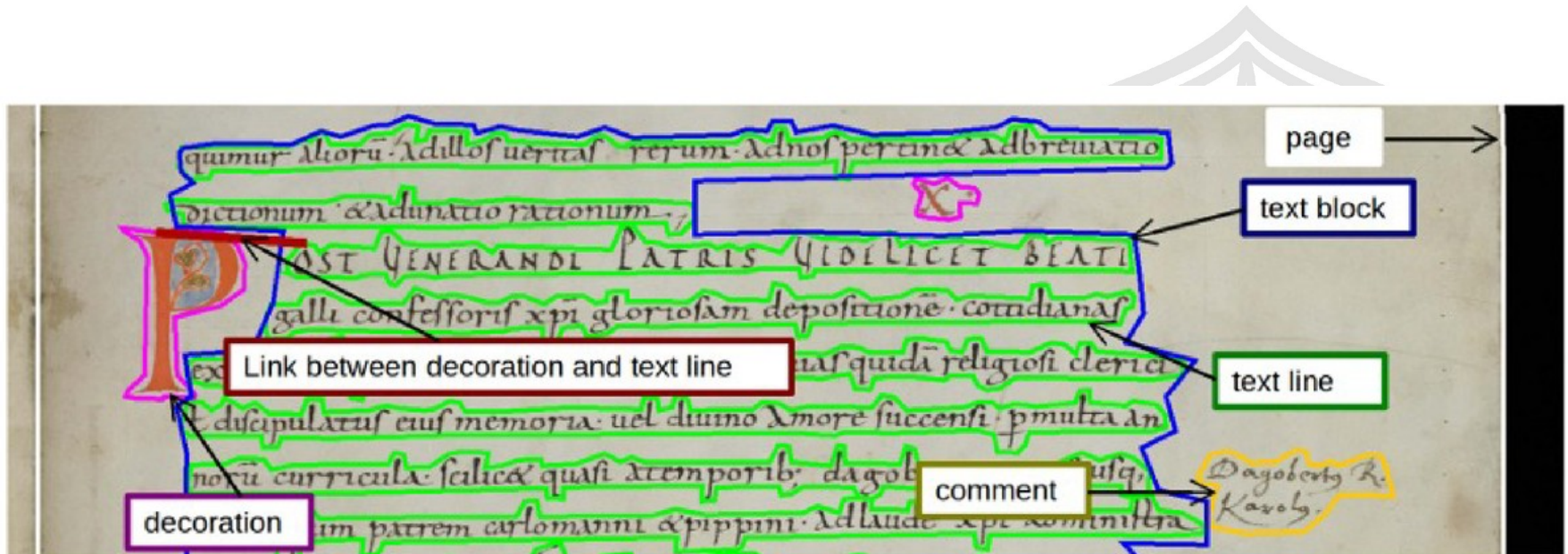
Local Gradient Feature Descriptor

# Historical Document Analysis

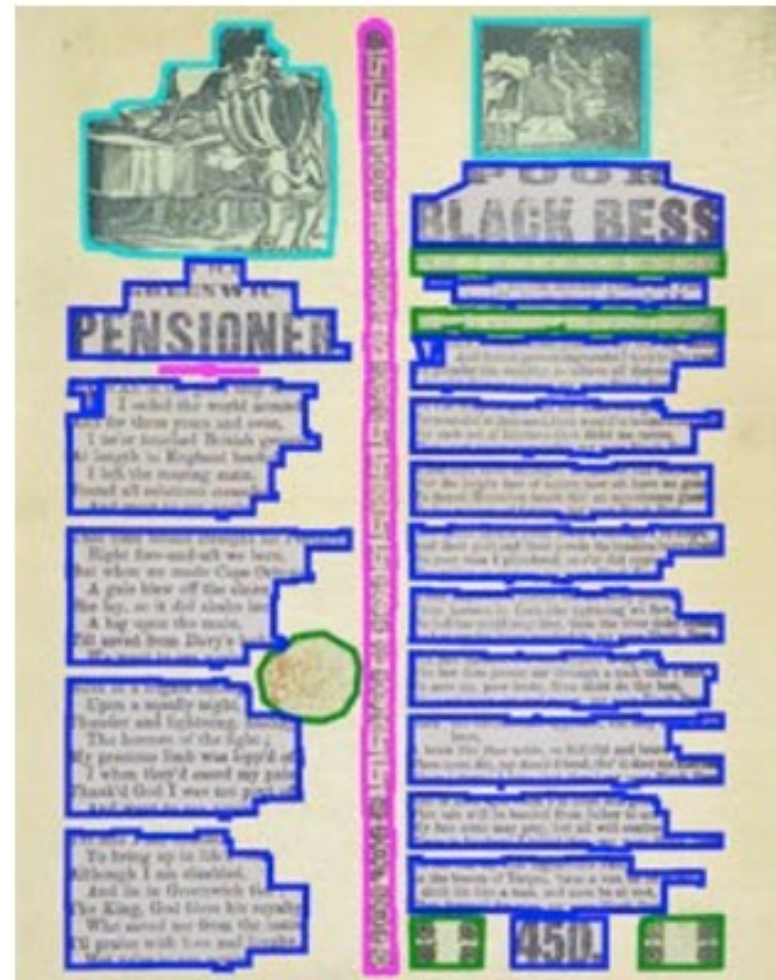




# Historical Document Layout Analysis

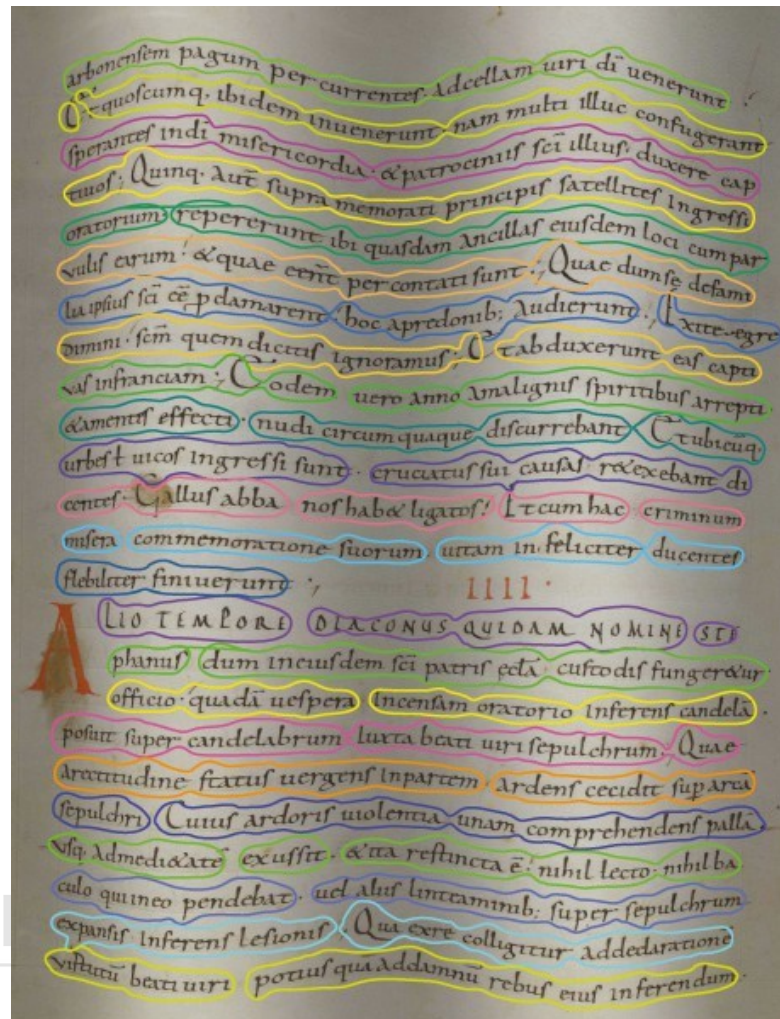


# Historical Document Layout Analysis



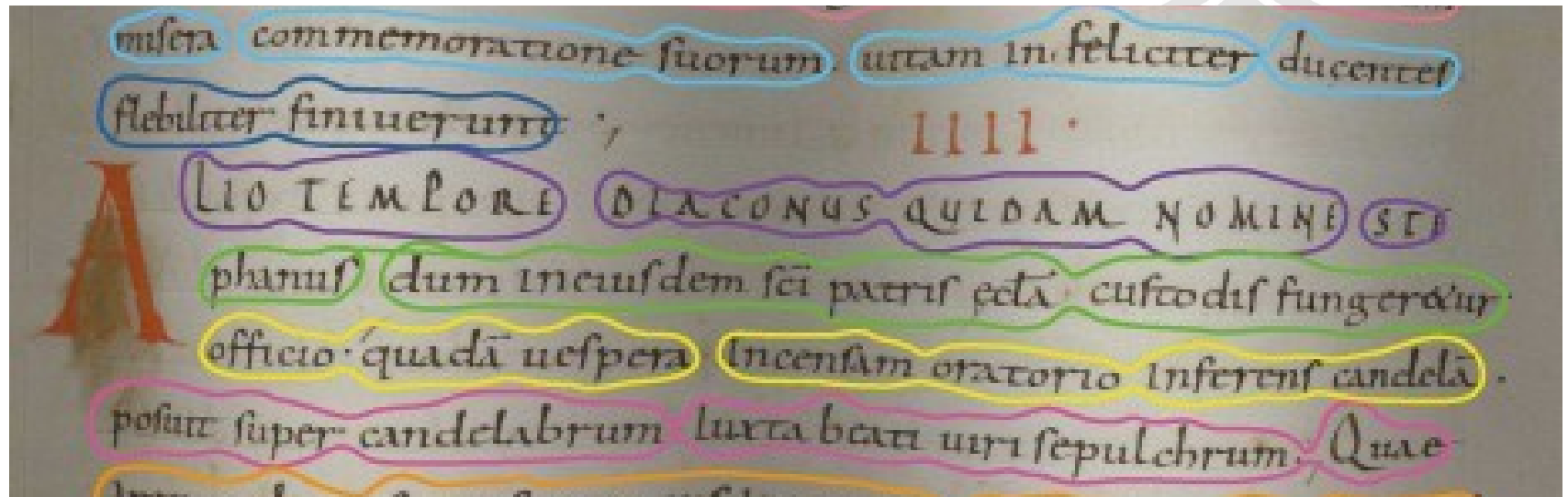


# Line Segmentation

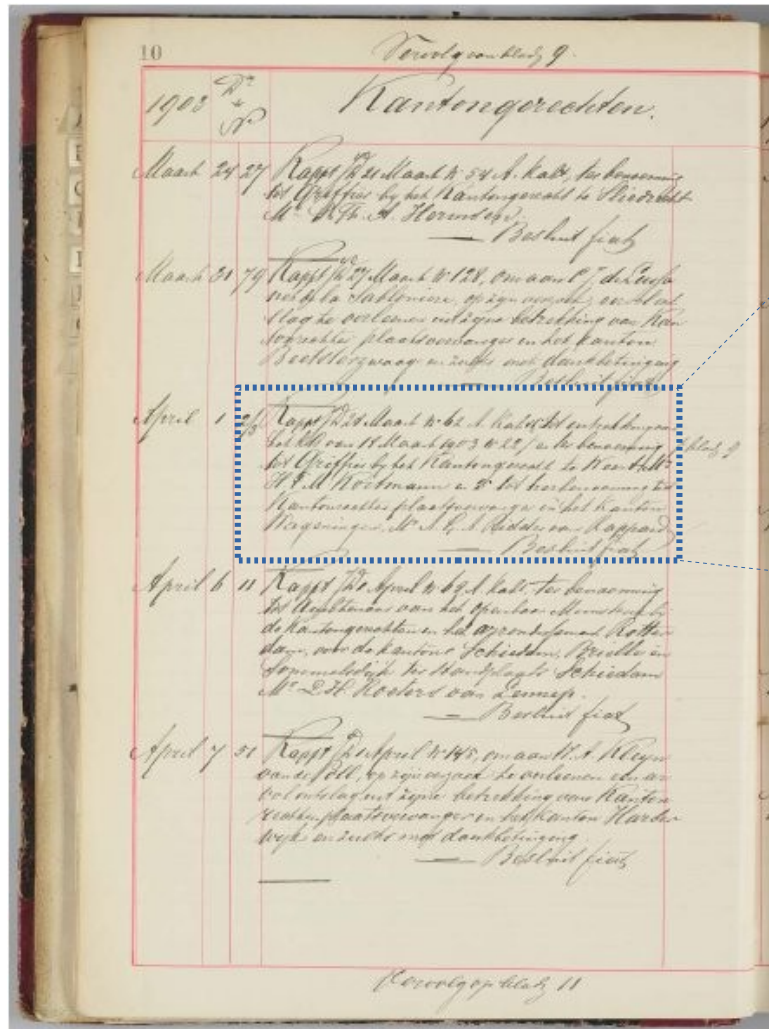


MAHASA  
UNIVE

# Line Segmentation



# Line Segmentation



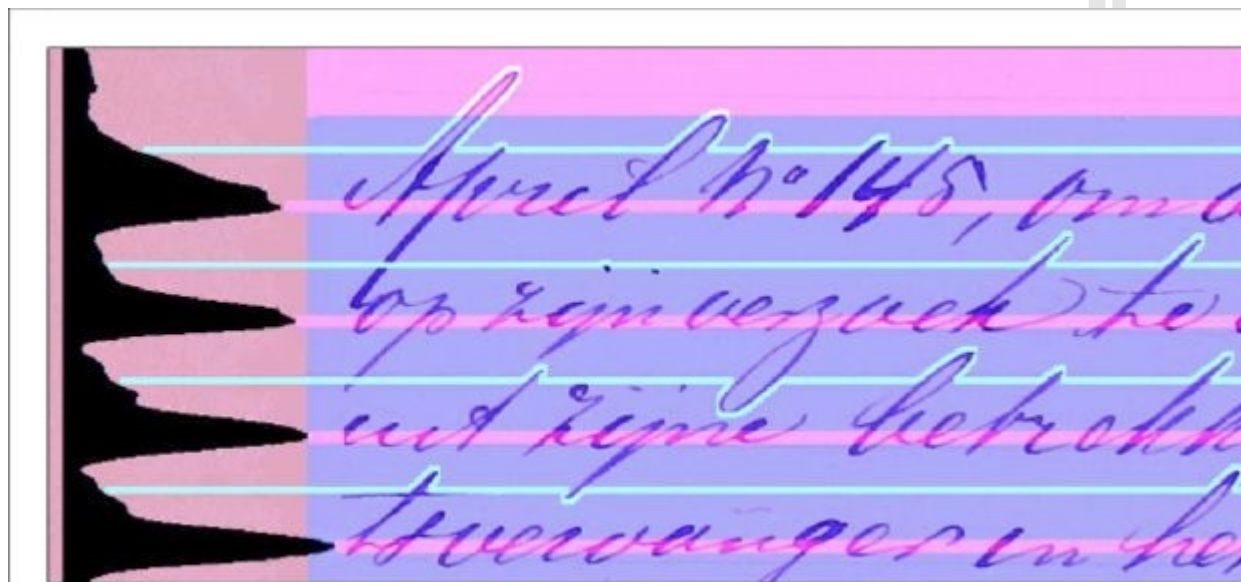


# Line Segmentation



heeft ingesepara  
renen het aan

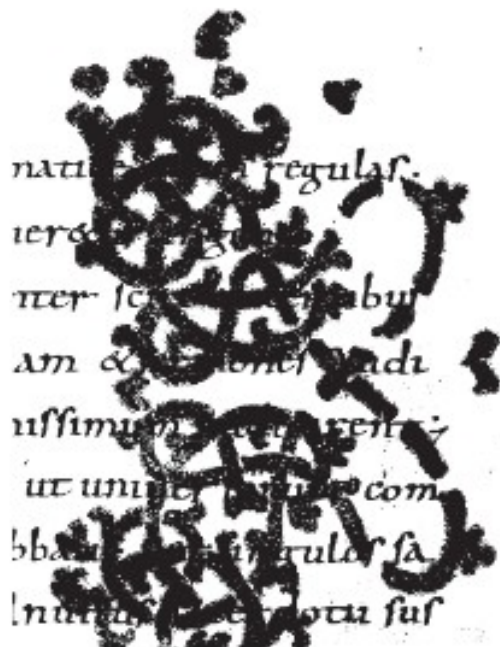
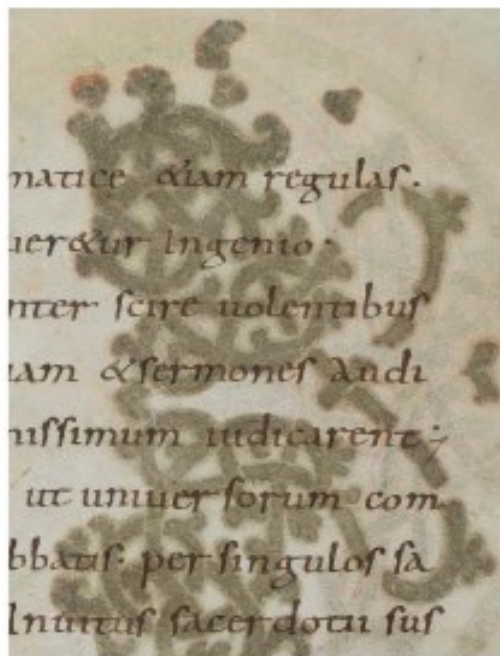
Fail



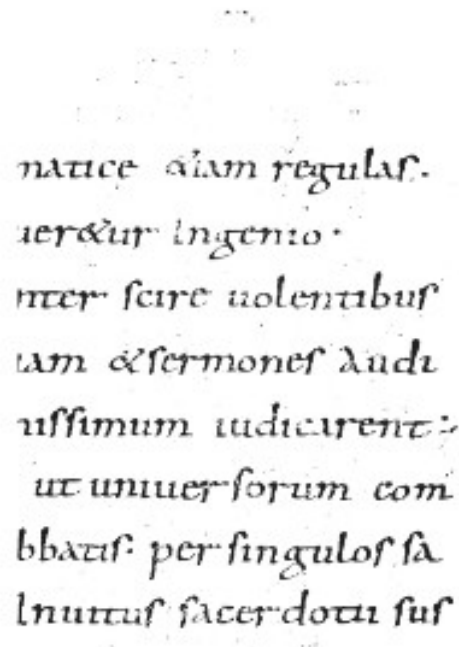
April 15 148, om a  
op zijn verzoek te  
uit zijne bebrok  
teverwangeren he

# Line Segmentation

## Binarization technique



Otsu's algorithm



Sauvola's algorithm

# Line Segmentation

## A\* Path Planning Algorithm

$$p^* = \arg \min_{p^a} \sum_{i=1}^{n^a-1} C(s_i^a, s_{i+1}^a)$$

where  $C(s_i, s_j)$  is the cost to go from state  $s_i$  to state  $s_j$ .

Qui nra reliquimus.  
dim sequeremur.

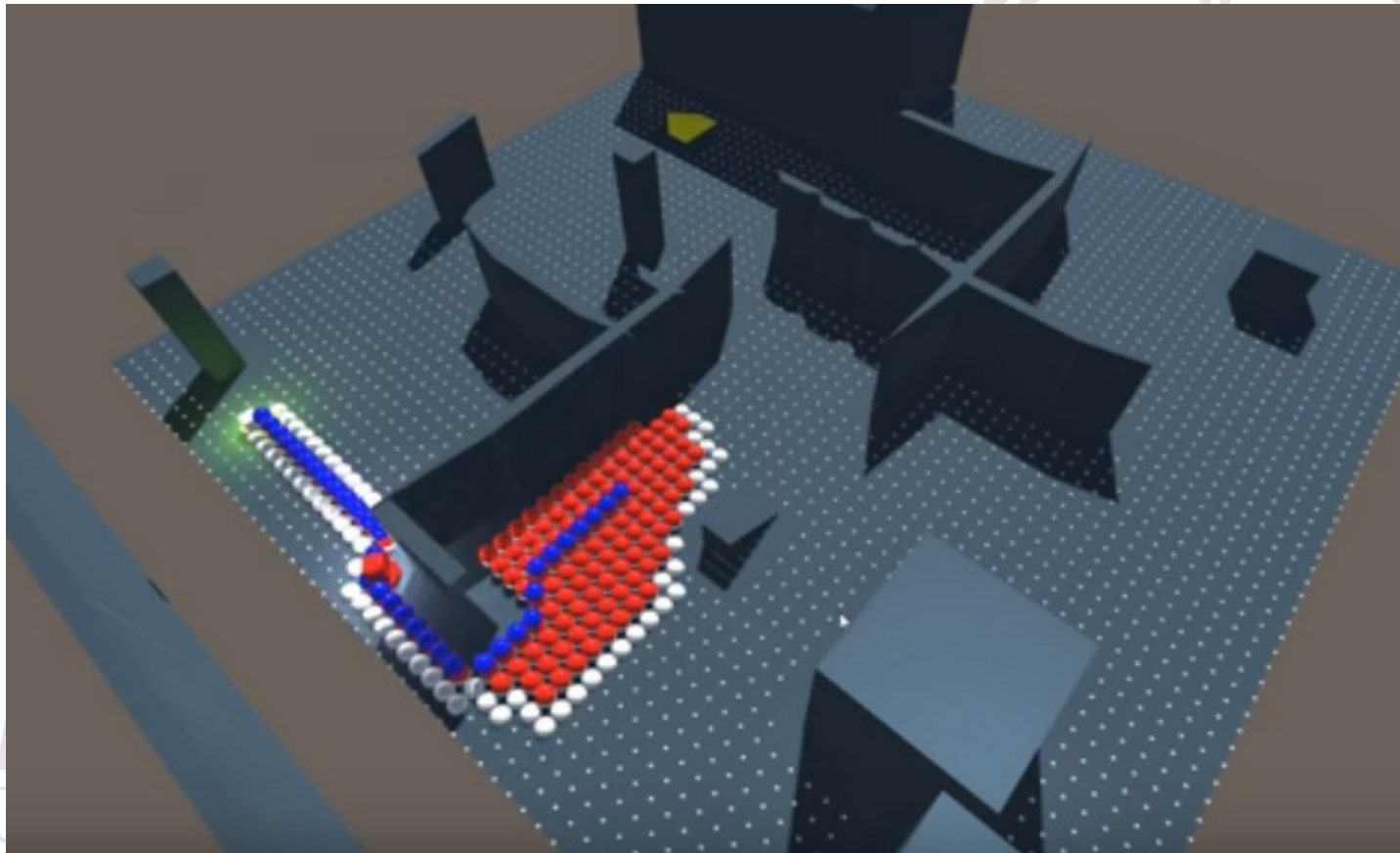
Ende also Gott  
is thamen laus

MAHASARAKHAM  
UNIVERSITY

พูน ปณ จิต สีเว

# Unity3D – A\* Pathfinding algorithm

<https://www.youtube.com/watch?v=Ny63E6iLkpc>



# New A\* Path Planning Algorithm

$$C(s_i, s_j) = c_d D(s_i) + c_{d2} D(s_i)^2 + c_m M(s_i) \\ + c_v V(s_i) + c_n N(s_i, s_j)$$

Qui nra reliquimus: ut secundum euangelicam iussione  
dm sequeremur: non debemus alienas amplecti diuitias.

(a)

It is Rekeninge ende Opboeren d'ants van Boechop  
Ouerste Rekenmeesters der Lande van Beere. Ende

(b)

UNIVERSITY



# New A\* Path Planning Algorithm

Het Levolking. capitel. wordt ten aansen van  
de Geboorte. Overlyden en Thewelyk by den dag.

(c)

Три дѣти (сѣ) пѣли пла  
снныхъ дѣрѣ Короле' Фран

(d)

UNIVERSITY

# New A\* Path Planning Algorithm

coepit galliae uel germaniae diffamari provincias ;  
Laudabatur ab omnibus colebatur acunctis. Ad deo. ut  
theodericus rex filius hildiberti. nepos sigiberti. qui eo  
tempore burgundionibus regnabat. ad eum sepe ue  
niret. & precum eius suffragia summa cum deuotione  
deposceret ; Quem cum pater se in creparet. cur concu  
binarum pollueretur amplexibus. & non potius legitime  
coniugis conubio frueretur. monitis eius obtemperans.  
cuncta huiusmodi illicita. se uitaturum promisit ;  
Sed brunnihildis uxor regis. uidens eum uiri diu consilium  
obedire. famulo malitiae conuicta. mentem serpentino  
furoris armauit ueneno ; Verebatur enim. ne si abiectis

# New A\* Path Planning Algorithm

на лишиаро . хрѣпѣомѣ о порѣ  
Готподѣмѣ . и пойнѣмѣ наши поинѣ  
Своѣ поинѣ поинѣ оѣ поинѣ еѣ  
Пторнѣмѣ . А пойнѣмѣ хрѣпѣмѣ  
на поинѣмѣ у поинѣмѣ еѣ поинѣмѣ  
еѣ . на поинѣмѣ поинѣмѣ на поинѣмѣ  
Своѣ поинѣмѣ у поинѣмѣ бо . поинѣмѣ  
поинѣмѣ Готподѣмѣ у поинѣмѣ поинѣмѣмѣ

# Handwritten Character Recognition

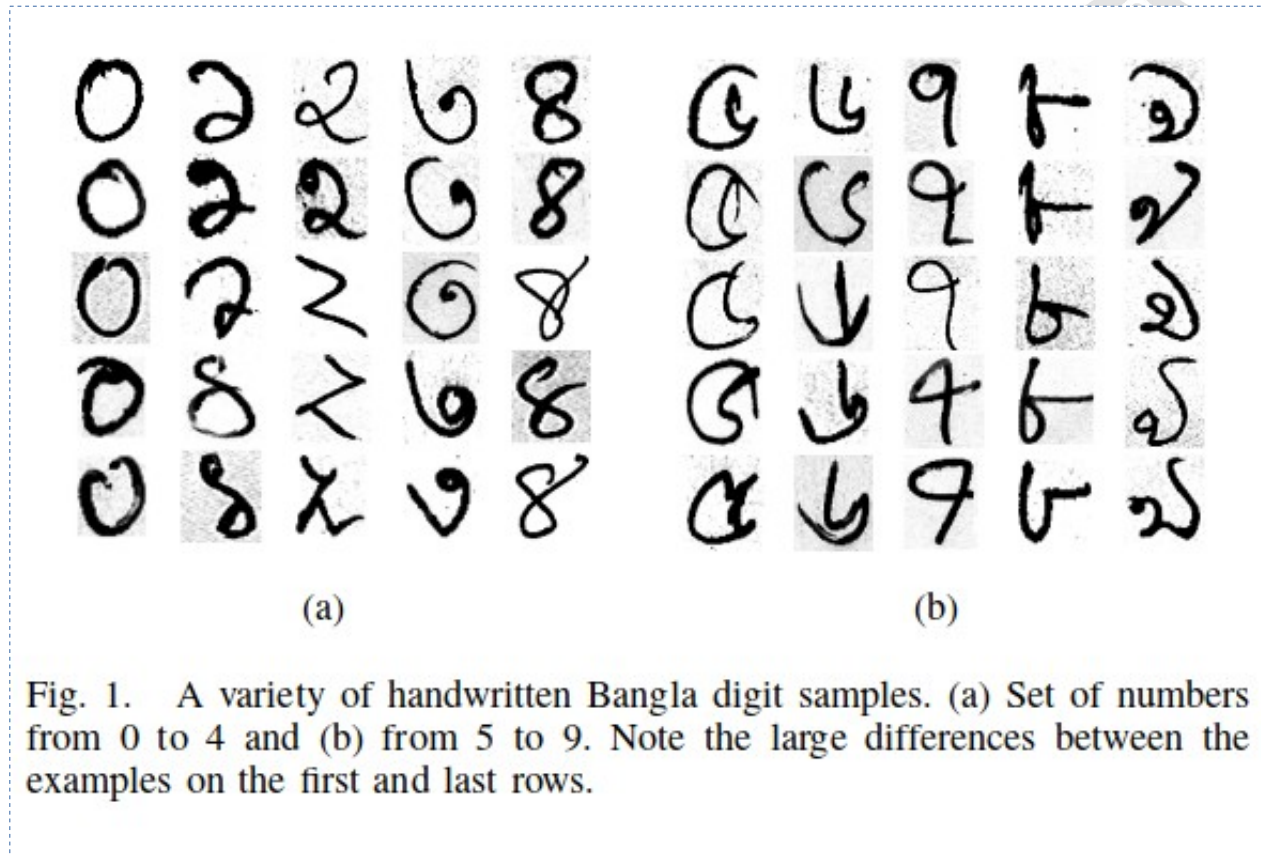


Fig. 1. A variety of handwritten Bangla digit samples. (a) Set of numbers from 0 to 4 and (b) from 5 to 9. Note the large differences between the examples on the first and last rows.

# Handwritten Character Recognition

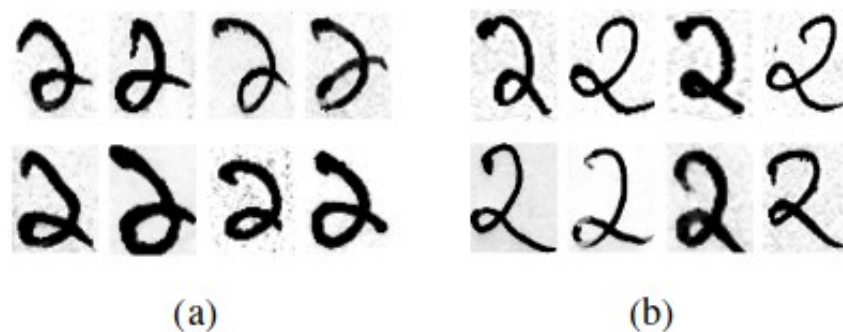
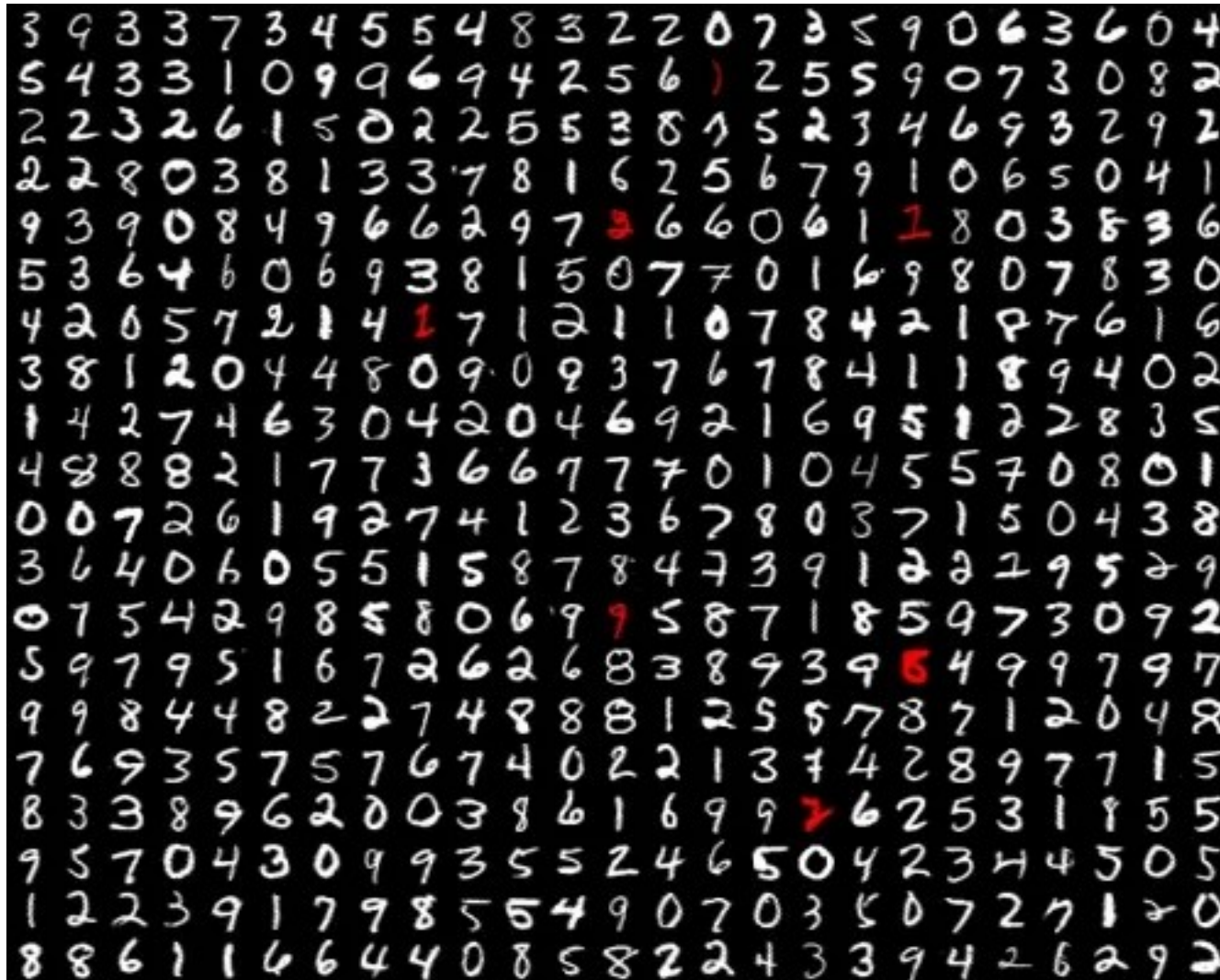


Fig. 2. Similarities between different handwritten Bangla digits. (a) The images of number 1, and (b) number 2.



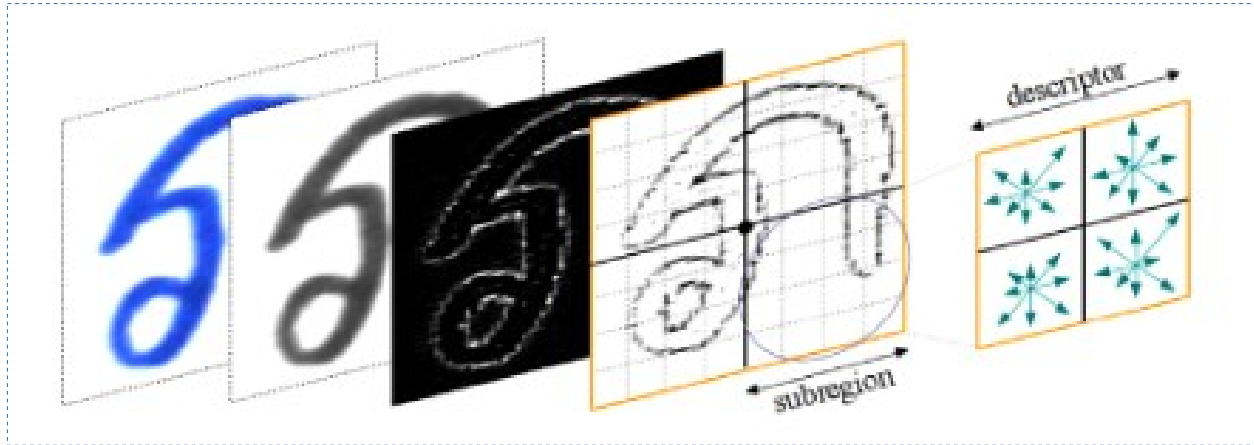
# Handwritten Character Recognition



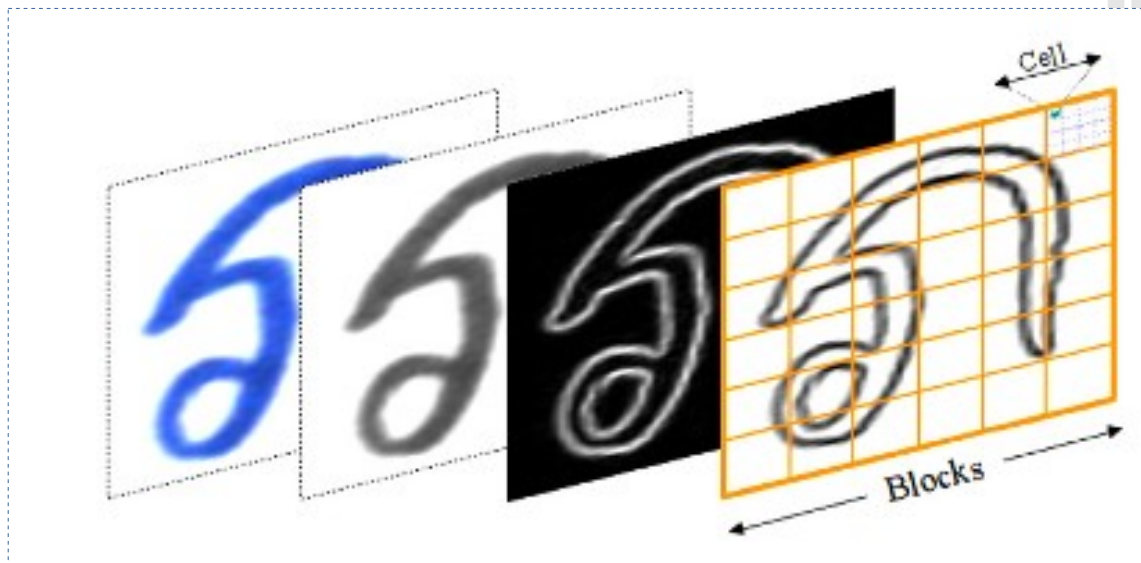
MNIST



# Feature Extraction Techniques

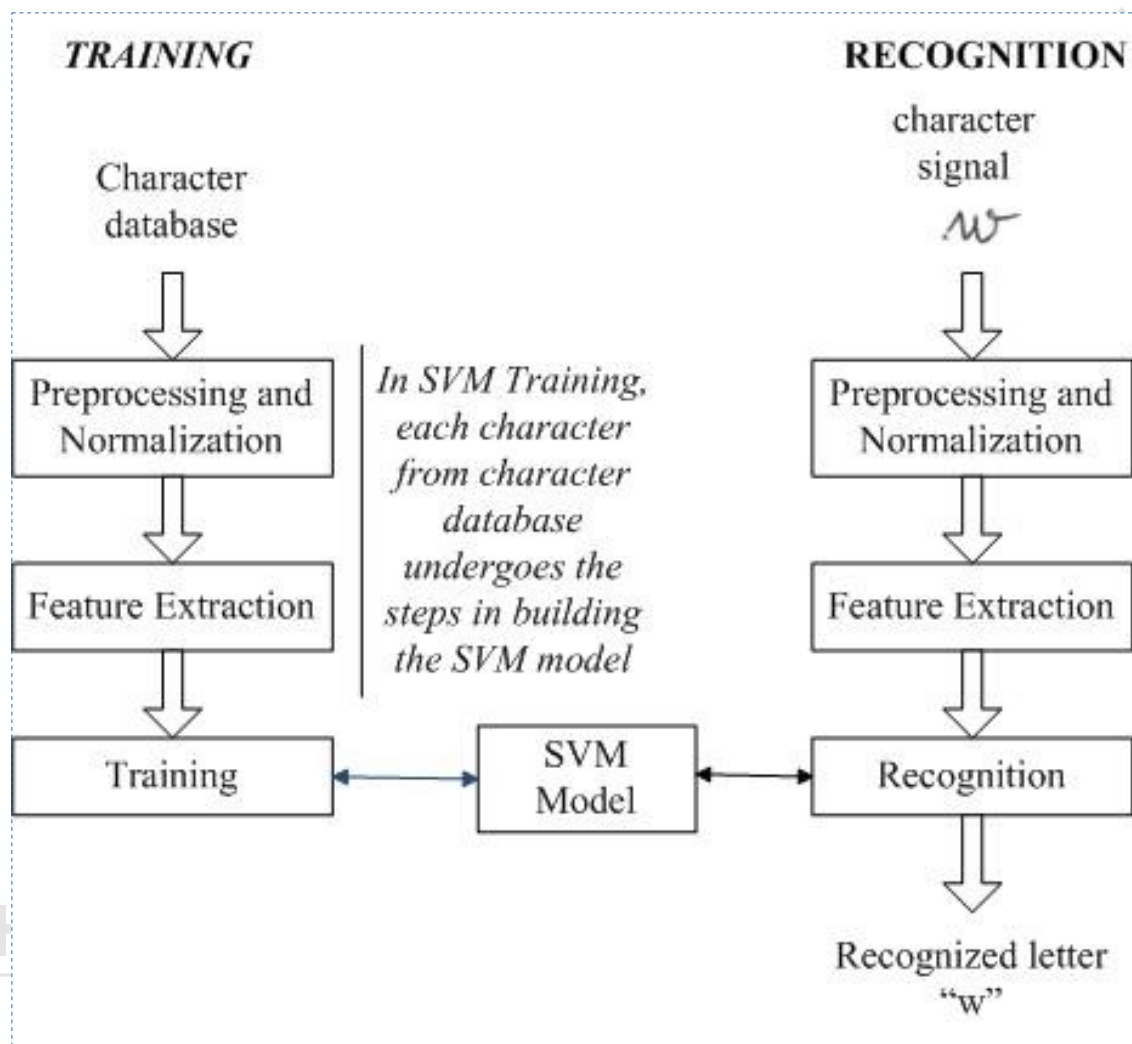


SIFT

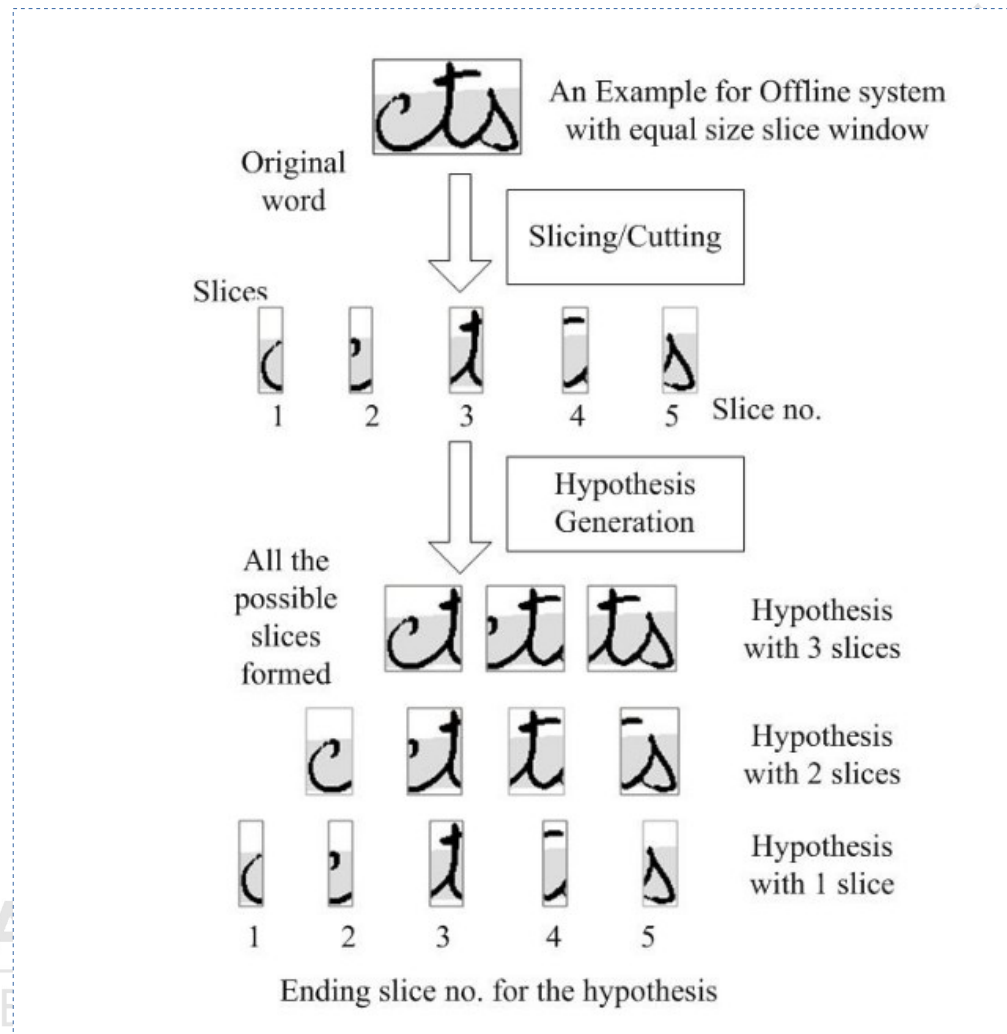


HOG

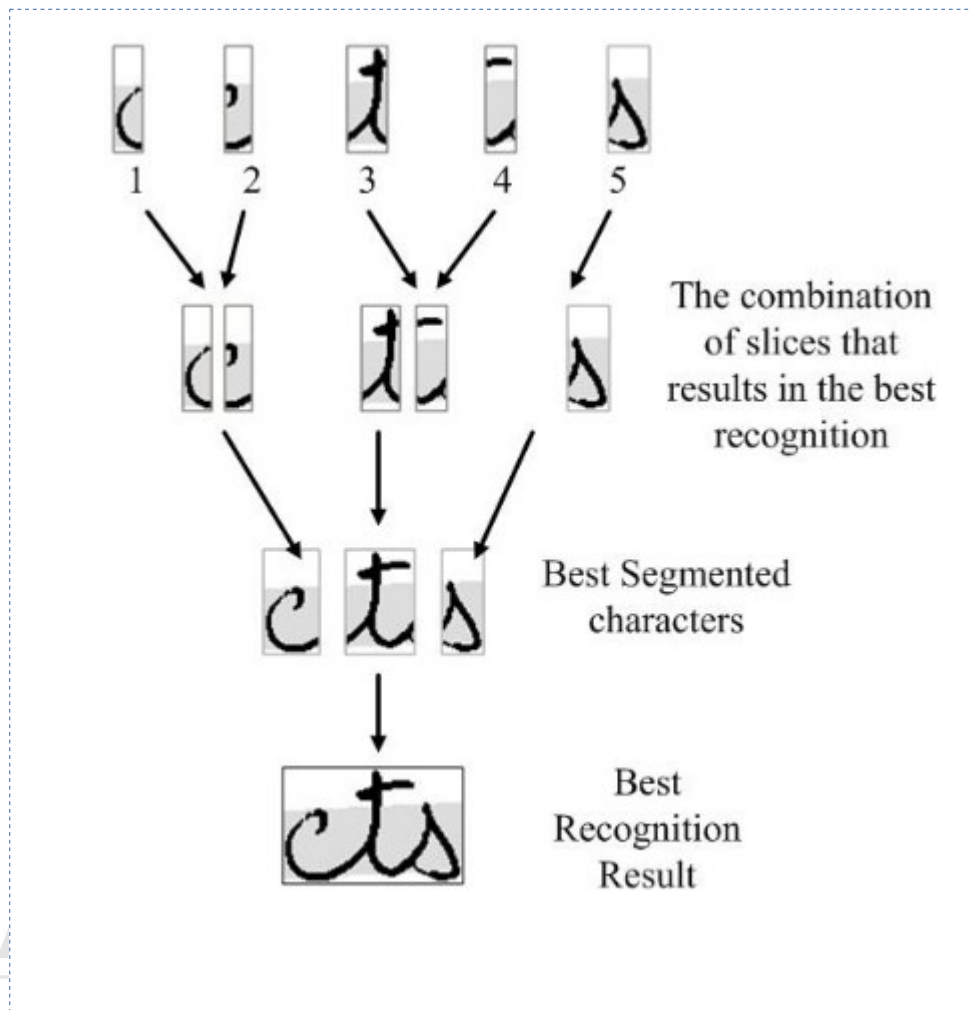
# Handwritten Character Recognition



# On-line Handwriting Recognition



# On-line Handwriting Recognition





myscript.com



NMD faculty - r acuity Informatics



NMD faculty - r acuity Informatics

NMD

faculty

faculty

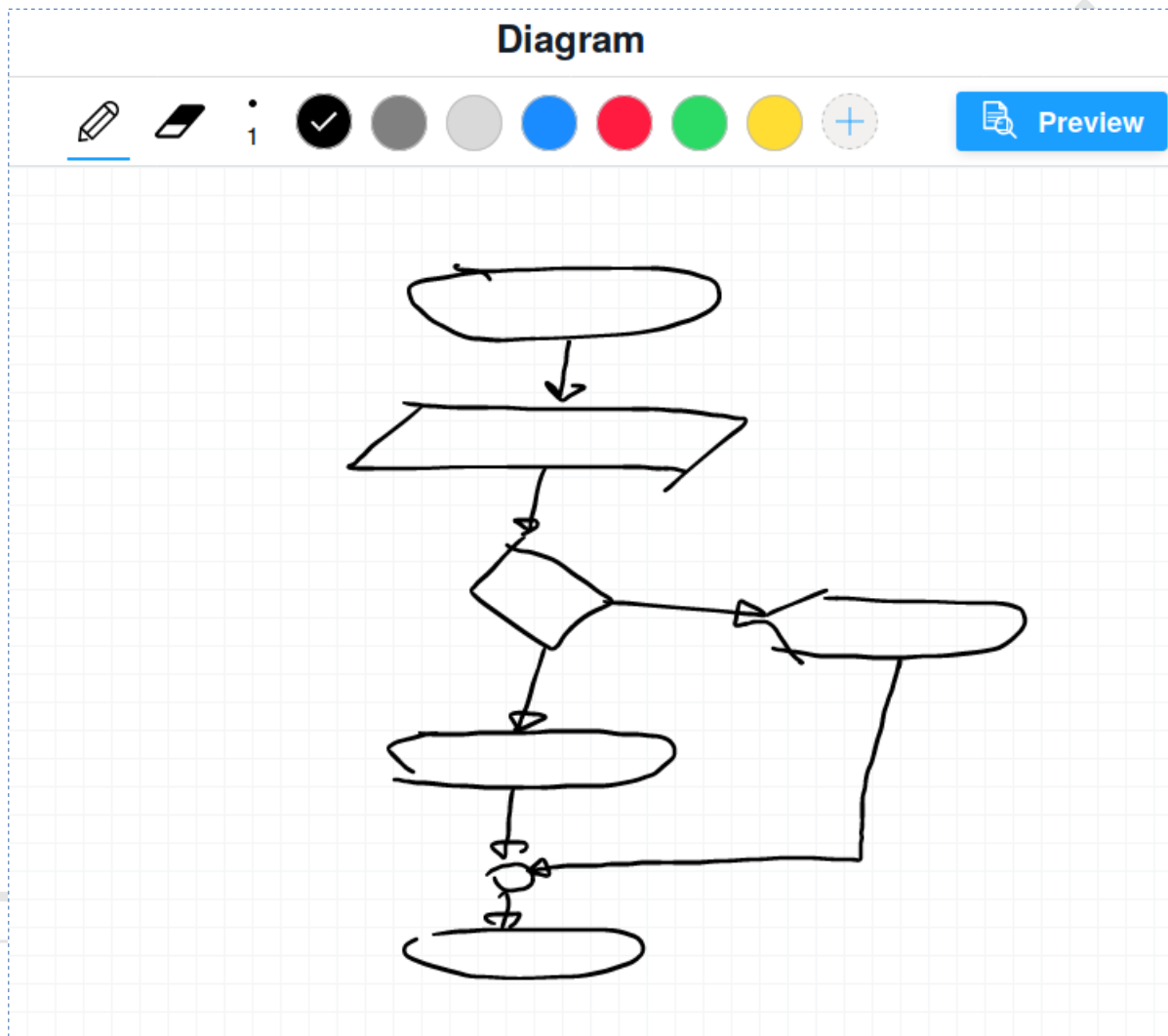
Informatics



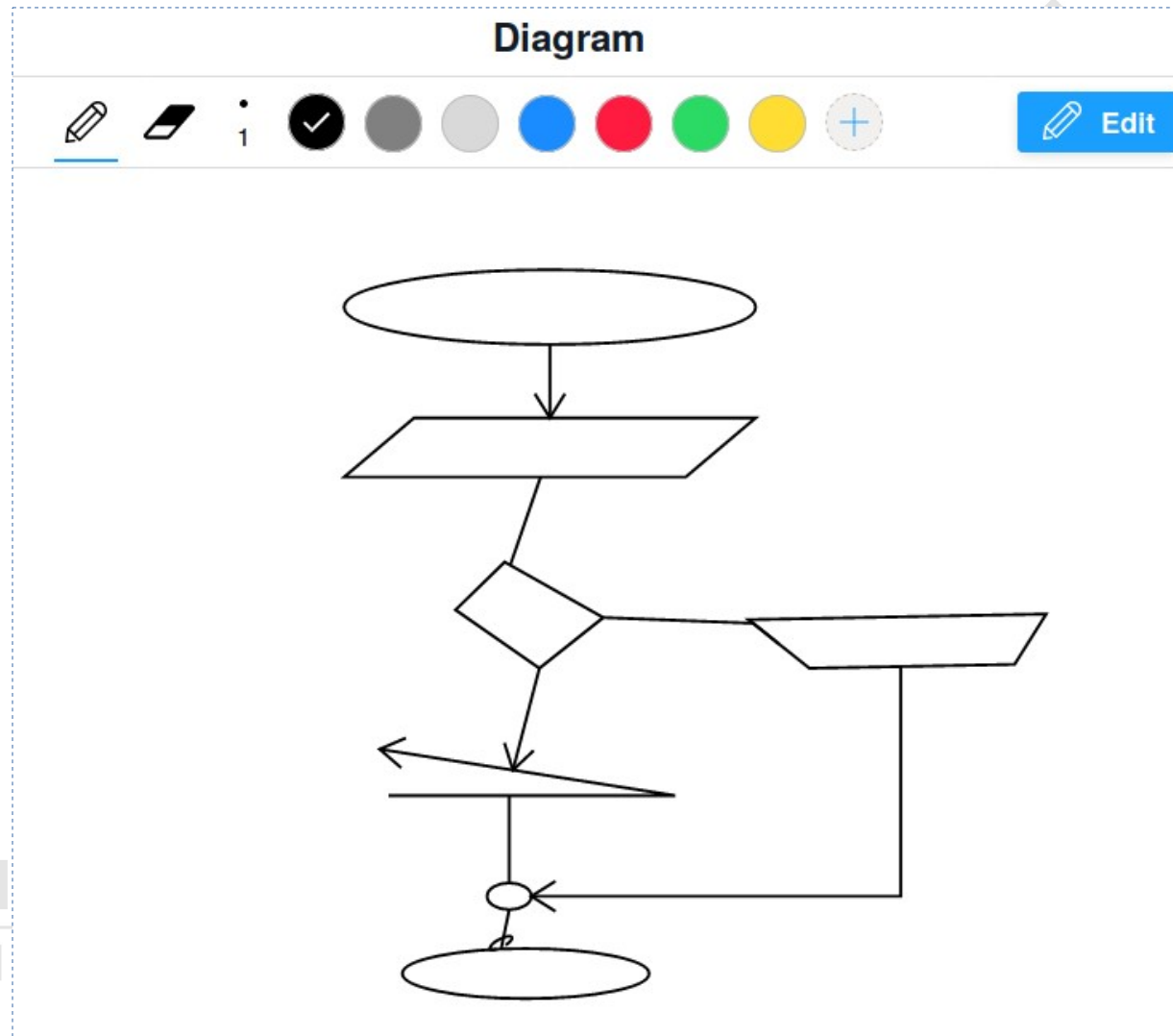
MyScript.

<https://webdemo.myscript.com/>

# myscript.com - Demo

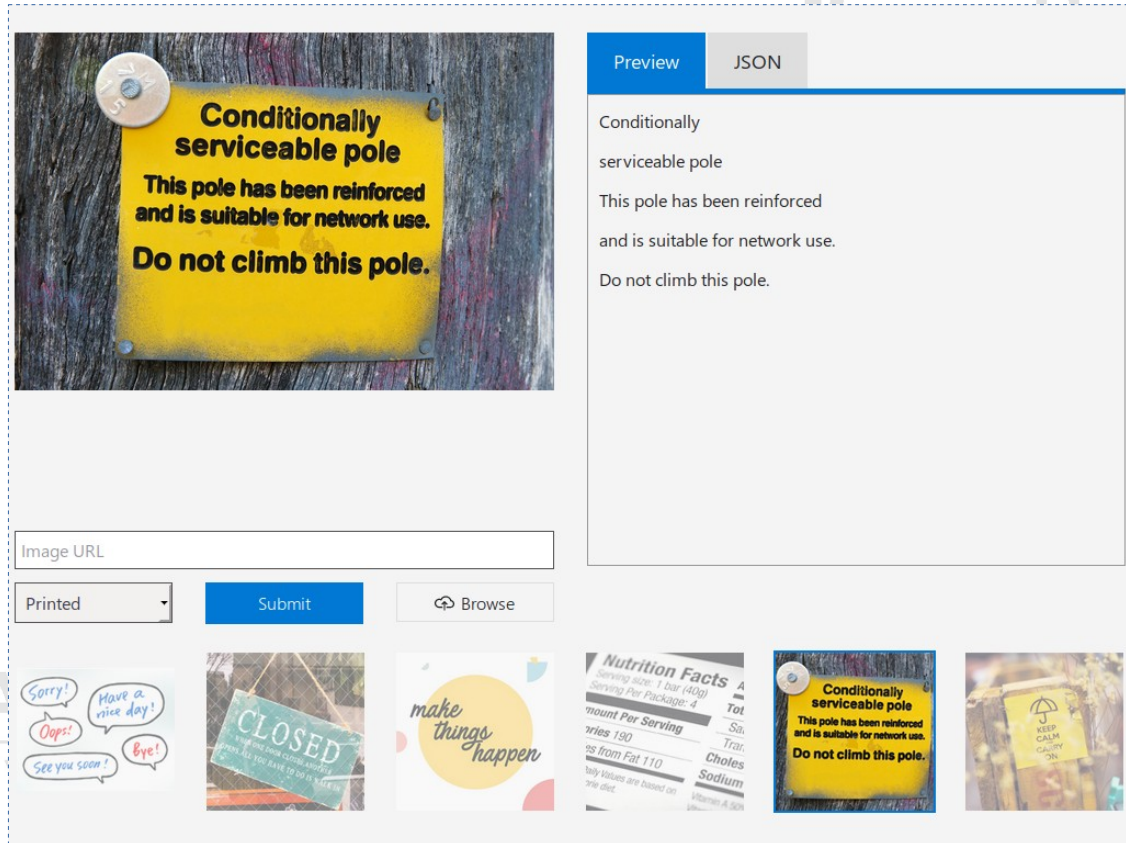


# myscript.com - Demo



# Demo

<https://azure.microsoft.com/en-us/services/cognitive-services/computer-vision/>



The screenshot displays the Azure Computer Vision API interface. On the left, a yellow sign with black text is shown. The text on the sign reads: "Conditionally serviceable pole", "This pole has been reinforced and is suitable for network use.", and "Do not climb this pole." Below the image, there is a text input field labeled "Image URL", a "Printed" dropdown menu, a "Submit" button, and a "Browse" button. On the right, the "Preview" tab is selected, showing the detected text in a structured format. Below the main interface, a row of five small thumbnail images is displayed, including a sign with speech bubbles, a "CLOSED" sign, a "make things happen" graphic, a "Nutrition Facts" label, and another instance of the yellow sign.

Image URL

Printed Submit Browse

Conditionally serviceable pole

This pole has been reinforced and is suitable for network use.

Do not climb this pole.

Sorry! Have a nice day! Oops! Bye! See you soon!

CLOSED

make things happen

Nutrition Facts

Conditionally serviceable pole



# Image Recognition

- **Image Recognition** is a term for computer technologies that can recognize certain people, animals, objects or other targeted subjects through the use of algorithms and machine learning concepts.
- The term “*image recognition*” is connected to “*computer vision*,” which is an overarching label for the process of training computers to “see” like humans, and “image processing,” which is a catch-all term for computers doing intensive work on image data.

UNIVERSITY

# Image Recognition



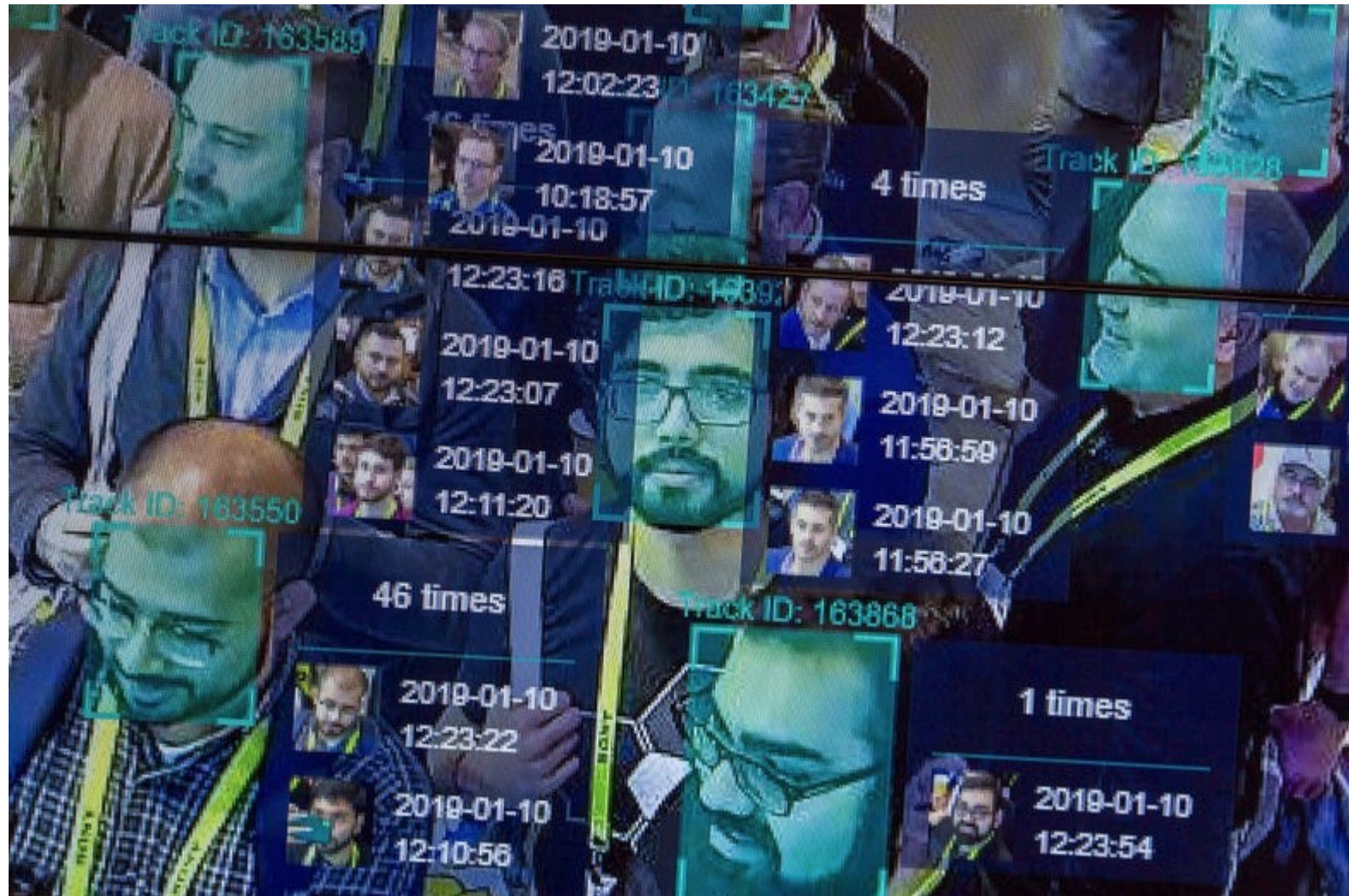
MAHASARAKHAM  
UNIVERSITY

พูน ปอ ตีโต สีเว

<https://thenextweb.com/contributors/2018/10/29/heres-how-face-recognition-tech-can-be-gdpr-compliant/>

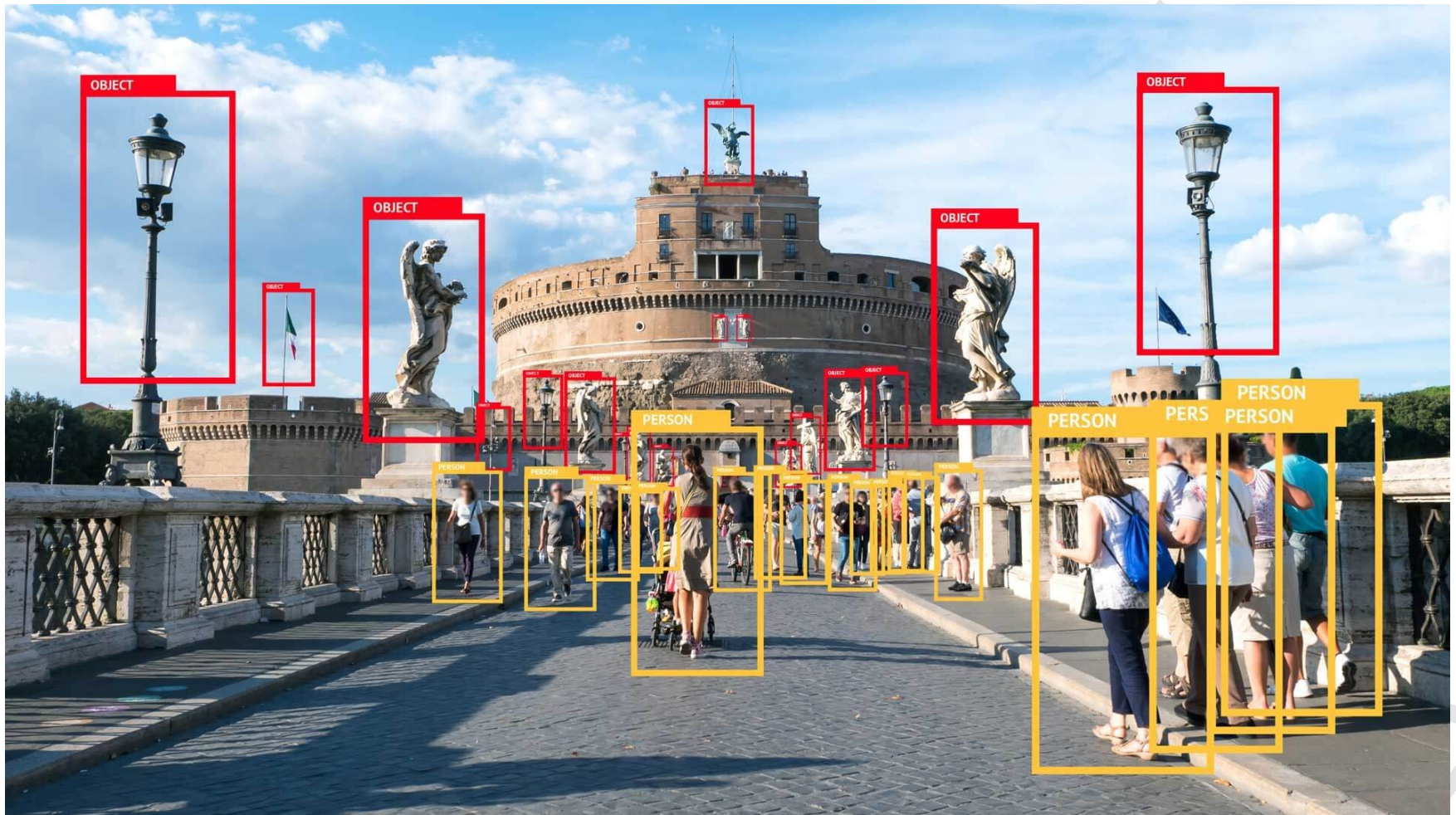


# Image Recognition



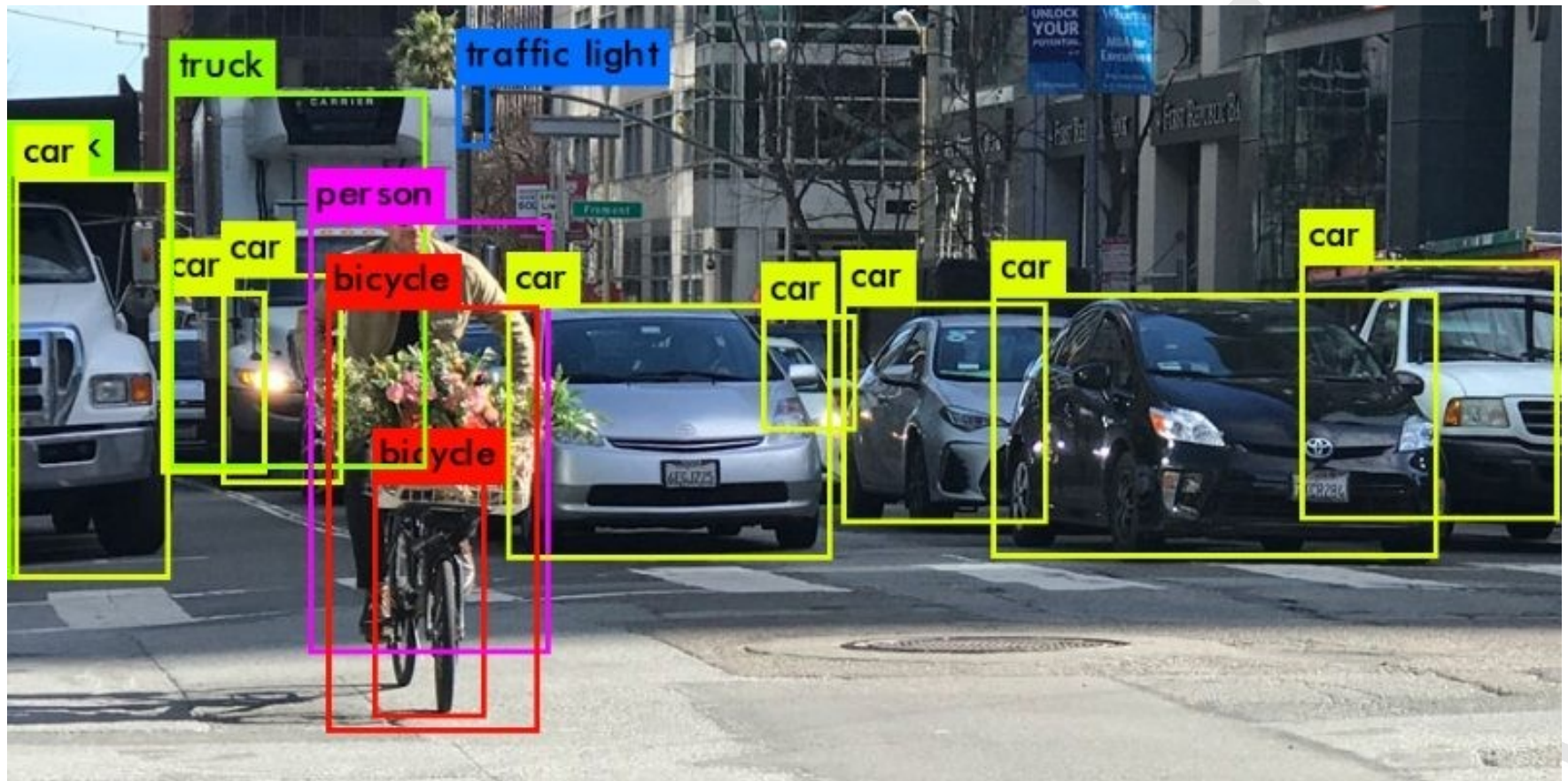


# Image Recognition





# Image Recognition



MAHASARAKHAM  
UNIVERSITY

พูน ปณ จิต สีเว

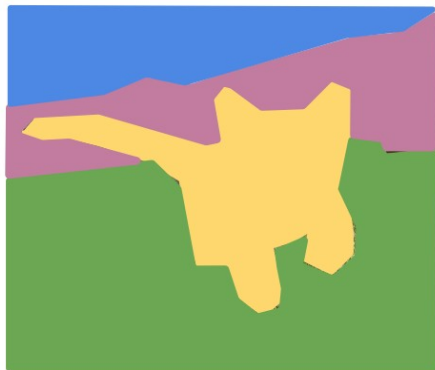
# Image Segmentation





# Image Segmentation

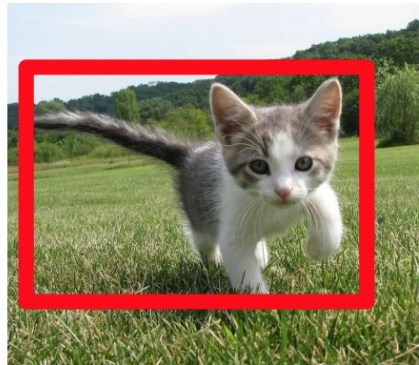
**Semantic Segmentation**



GRASS, CAT,  
TREE, SKY

No objects, just pixels

**Classification  
+ Localization**



CAT

Single Object

**Object  
Detection**



DOG, DOG, CAT

Multiple Object

**Instance  
Segmentation**



DOG, DOG, CAT

This image is CC0 public domain

# Ship Detection & Segmentation



MA  
UNIVERSITY

มหาวิทยาลัยเทคโนโลยีพระจอมเกล้าธนบุรี

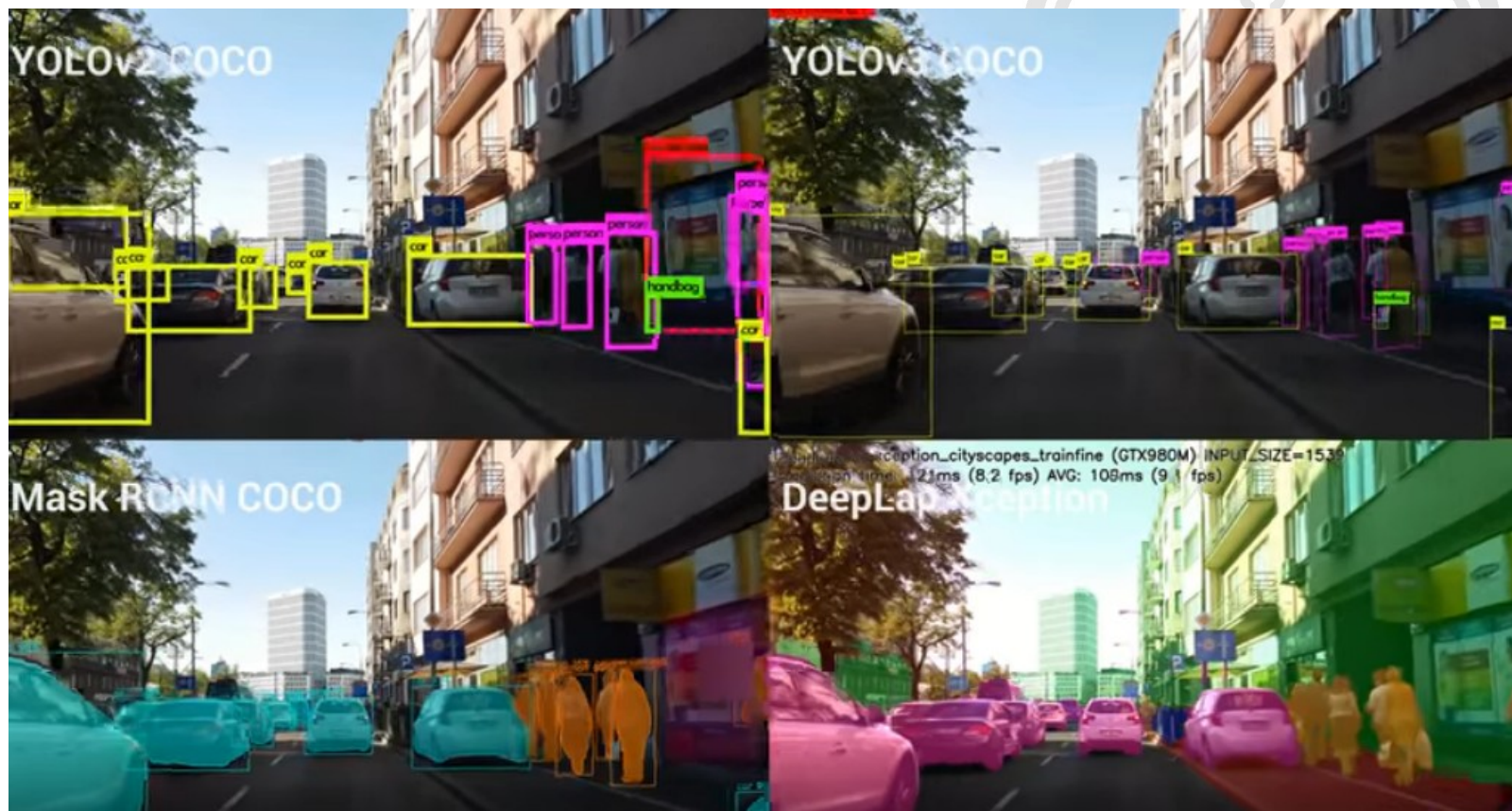


# Ship Detection & Segmentation



# Image Detection & Segmentation

[https://www.youtube.com/watch?v=s8Ui\\_kV9dhw](https://www.youtube.com/watch?v=s8Ui_kV9dhw)




# Auto-Tagging |

<https://imagga.com/auto-tagging-demo>

Auto-Tagging demo

## Upload your photo

You can upload a photo or paste a URL of an Image



Note: By uploading files here you agree to have them temporarily stored in our training dataset for the sole purpose of improving Imagga's technology.

UPLOAD IMAGE

Image URL

<https://imagga-com-assets.azureedge.net/static>

## Generated tag

English




### Concepts

dragonfly	100.00%
Insect	100.00%
arthropod	86.79%
bug	59.51%
Invertebrate	46.73%
ladybug	43.19%
fly	41.03%
close	39.38%
garden	38.57%
leaf	37.35%

[↪ show me more tags](#)

## Try with example images

Select one of the following Images to see the results:





# Auto-Tagging |

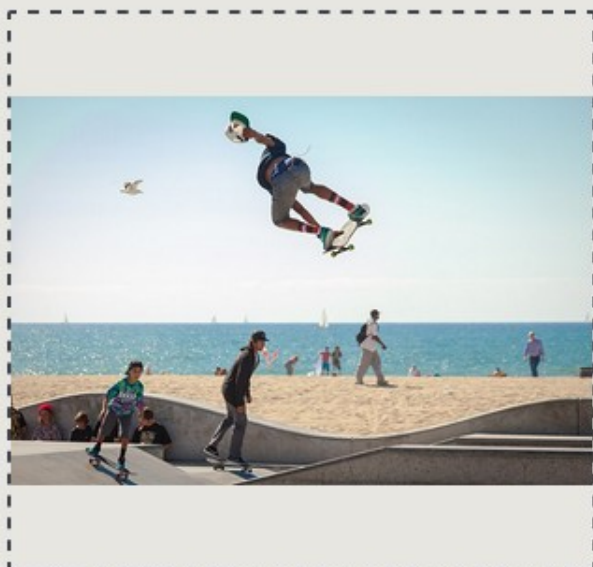
<https://imagga.com/auto-tagging-demo>

 Auto-Tagging demo

[← back to Imagga's homepage](#)

## Upload your photo

You can upload a photo or paste a URL of an Image



Note: By uploading files here you agree to have them temporarily stored in our training dataset for the sole purpose of improving Imagga's technology.

UPLOAD IMAGE

## Generated tag English ▾

Concepts

sport	59.44%
beach	52.96%
skate	50.00%
sea	46.19%
ocean	44.59%
active	38.89%
sand	38.68%
jumping	37.75%
sky	35.89%
summer	35.41%

[↪ show me more tags](#)

## Try with example images

Select one of the following Images to see the results:

## Start using our Tagging API.

Check our [Pricing Plans](#) or:

Sign Up for Free

## Implement in seconds

Shell

Node.js

Java

Python

PHP

```
curl --request GET \  
  --url 'https://api.imagga.com/v2/tag' \  
  --header 'accept: application/json' \  
  --header 'authorization: Basic YWNjaA=='
```

Powered by [APIEmbed](#)

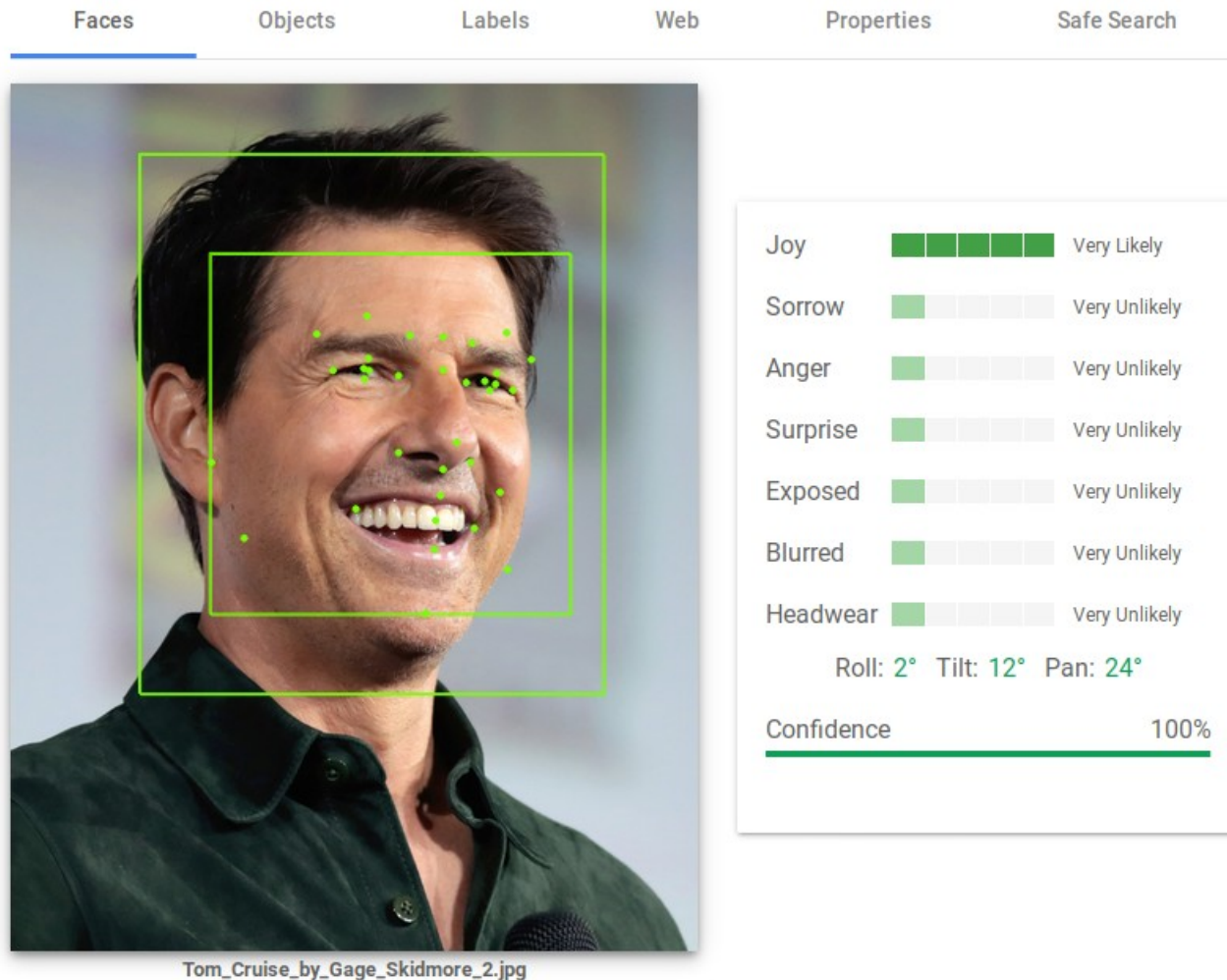
[Copy to Clipboard](#)

See Our Full [API Documentation](#)



# Vision AI | google

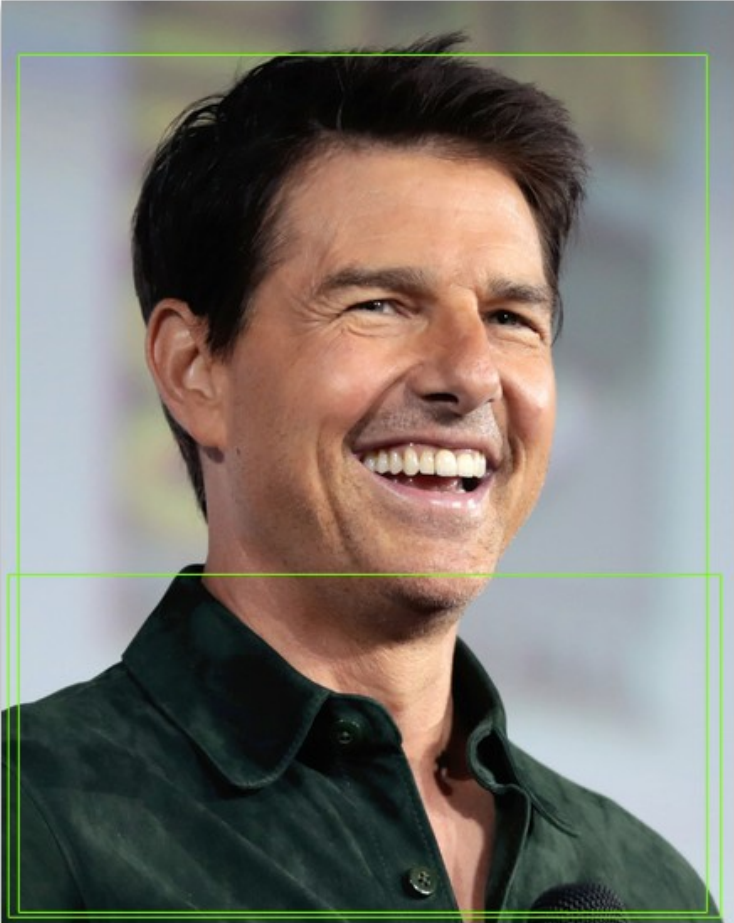
<https://cloud.google.com/vision>



# Vision AI | google

<https://cloud.google.com/vision>

Faces **Objects** Labels Web Properties Safe Search

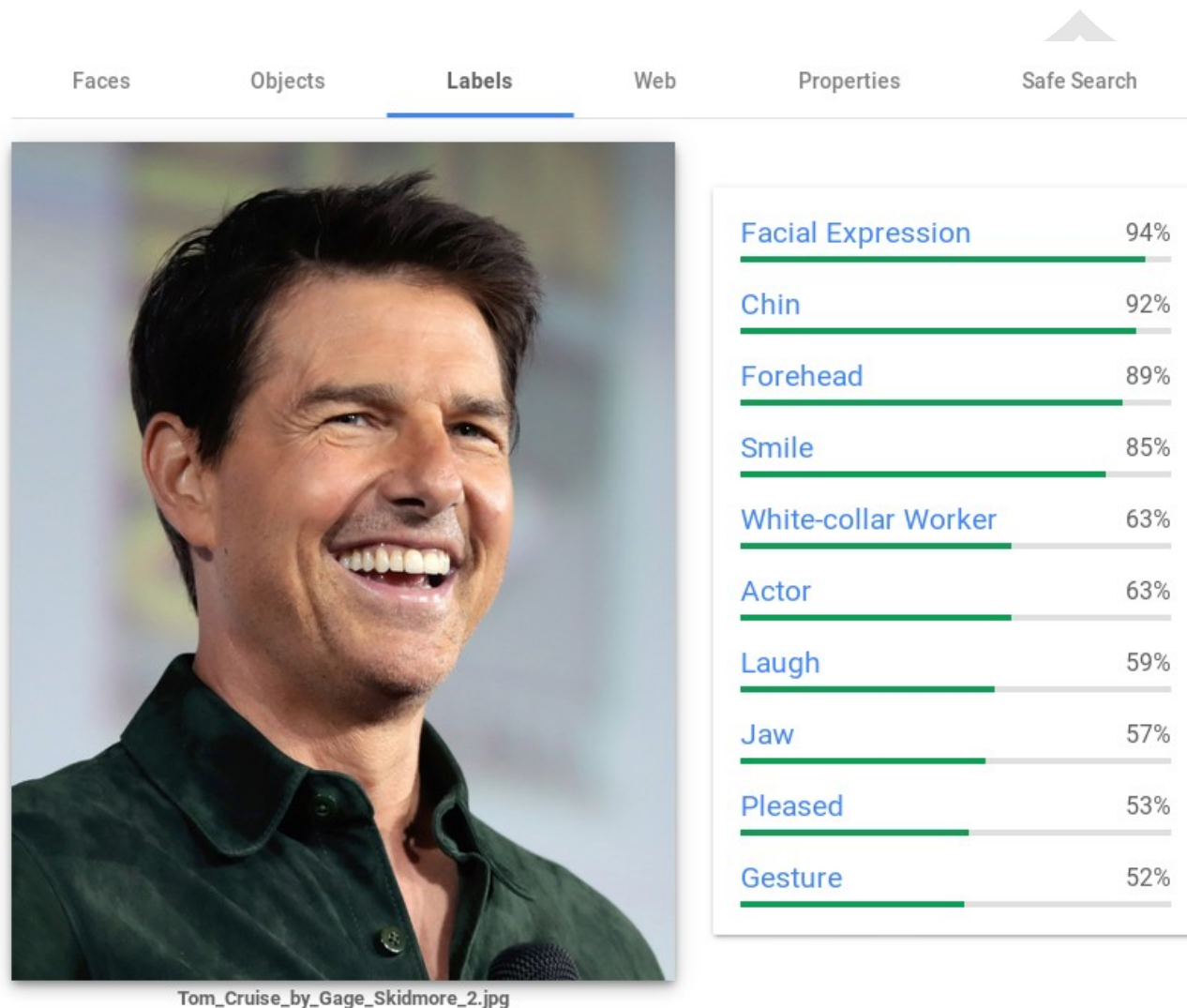


Tom\_Cruise\_by\_Gage\_Skidmore\_2.jpg

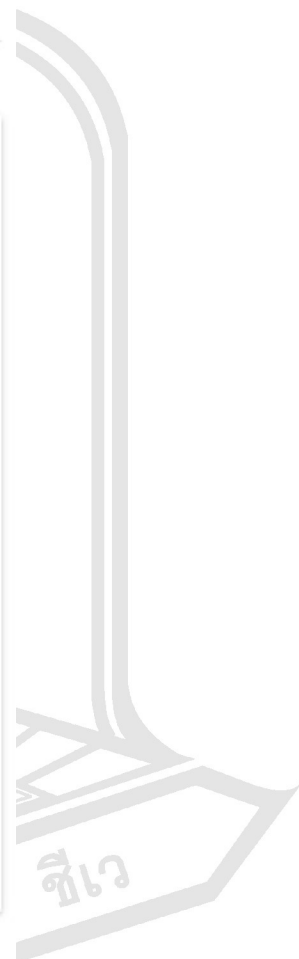
Man	81%
Clothing	76%

# Vision AI | google

<https://cloud.google.com/vision>



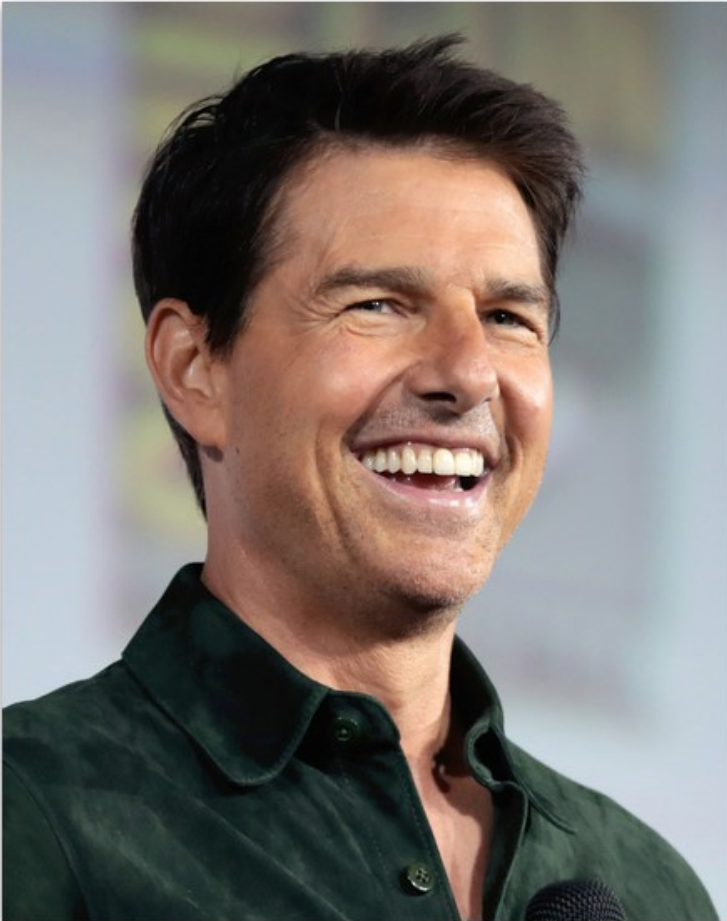
MA  
U N



# Vision AI | google

<https://cloud.google.com/vision>

Faces Objects Labels **Web** Properties Safe Search



Tom\_Cruise\_by\_Gage\_Skidmore\_2.jpg

### Web Entities

Tom Cruise	13.347
Top Gun: Maverick	0.795
Film	0.6141
Film Producer	0.5868
Actor	0.5741
Golden Globe Awards	0.4003
Top Gun	0.3956
Tom Cruise filmography	0.3751
Nicole Kidman	0.067
Justin Bieber	0.06631
Being Tom Cruise	0.0642
Kelly McGillis	0.05893
Endless Love	0.04892
Magnolia	0.04495

### Pages with Matched Images



# Vision AI | google

<https://cloud.google.com/vision>

Landmarks

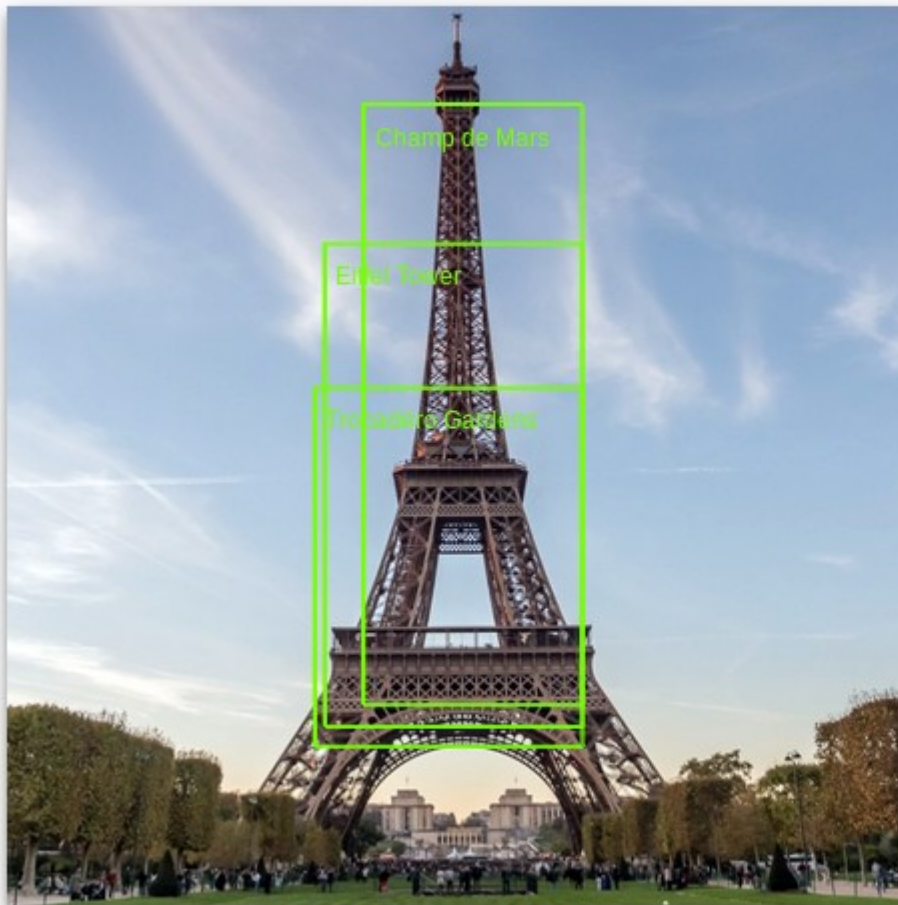
Objects

Labels

Web

Properties

Safe Search



picto\_myGoogleBusiness\_1.jpg

Eiffel Tower

89%



Location: 48.858461, 2.294351

Champ de Mars

87%





# Vision AI | google

<https://cloud.google.com/vision>

Landmarks

Objects

Labels

Web

Properties

Safe Search



picto\_myGoogleBusiness\_1.jpg

Building

64%

# Vision AI | google

<https://cloud.google.com/vision>

Landmarks

Objects

Labels

Web

Properties

Safe Search



picto\_myGoogleBusiness\_1.jpg

Landmark	98%
Tower	98%
Sky	97%
Iron	90%
Monument	90%
Architecture	90%
Cloud	84%
Spire	80%
Tourism	78%

# Vision AI | google

<https://cloud.google.com/vision>

Landmarks

Objects

Labels

Web

Properties

Safe Search

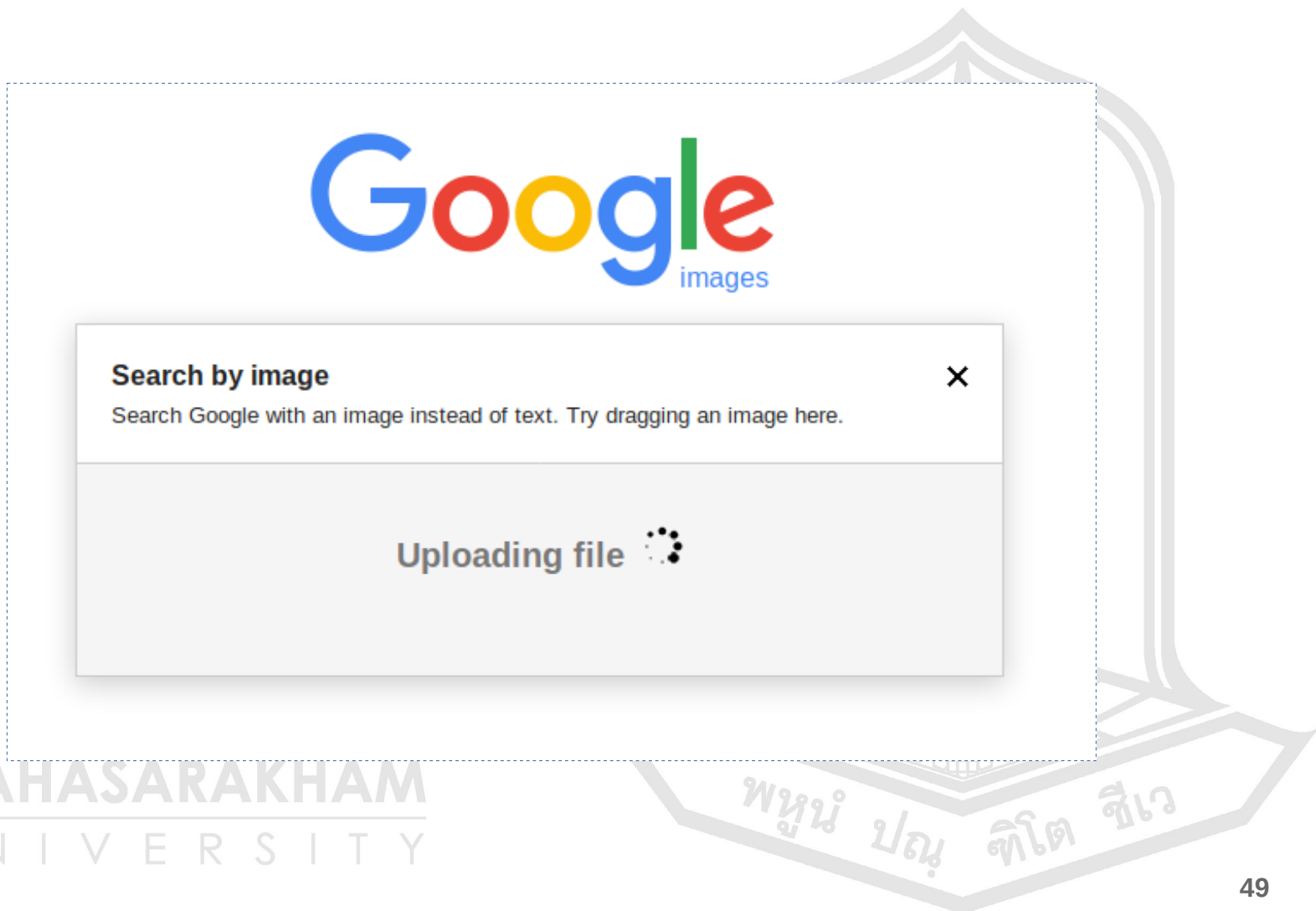


picto\_myGoogleBusiness\_1.jpg

## Web Entities




Eiffel Tower	2.1933
Tower	0.7109
Seine	0.58679
Louvre Museum	0.49172
The construction of the E...	0.3889
Event Tickets	0.328
Image	0.2901
Monument	0.2734
Coloring book	0.2539
1889	0.2164
Electronic ticket	0.2065
Color	0.1997
Paris	0.00193
France	0





# Google search





# Google search

 Tom\_C...more\_2.jpg × tom cruise  

All  Images  Maps  Shopping  More Settings Tools

About 25,270,000 results (1.13 seconds)




Image size:  
1762 × 2220


Find other sizes of this image:  
All sizes - Small - Medium - Large

Possible related search: [tom cruise](#)

W [https://en.wikipedia.org/wiki/Tom\\_Cruise](https://en.wikipedia.org/wiki/Tom_Cruise)

### Tom Cruise - Wikipedia


Thomas Cruise is an American actor and film producer. He has received several accolades for his work, including three Golden Globe Awards and nominations ...

 <https://www.imdb.com/name/>

### Tom Cruise - IMDb


Tom Cruise, Actor: Top Gun. In 1976, if you had told fourteen year-old Franciscan seminary student Thomas Cruise Mapother IV that one day in the not too ...


### Visually similar images



## Tom Cruise

American actor



 [tomcruise.com](https://tomcruise.com)

Thomas Cruise is an American actor and film producer. He has received several accolades for his work, including three Golden Globe Awards and nominations for three Academy Awards.

[Wikipedia](#)

**Born:** July 3, 1962 (age 57 years), [Syracuse, New York, United States](#)

**Height:** 1.7 m

**Spouse:** [Katie Holmes](#) (m. 2006–2012), [Nicole Kidman](#) (m. 1990–2001), [Mimi Rogers](#) (m. 1987–1990)

**Upcoming movies:** [Top Gun: Maverick](#), [Mission: Impossible 7](#), [Mission: Impossible 8](#)

### Quotes

[View 7+ more](#)

*Nothing ends nicely, that's why it ends.*

*I disagree with people who think you learn more from getting beat up than you do from winning.*

*I love kids. I was a kid myself, once.*

### Movies

[View 45+ more](#)

# Eye and Eye-pair Detection



Figure 1: Sample eye-pair regions for training the eye-pair detector.

# Eye and Eye-pair Detection



Figure 2: Sample eye (a) and non-eye (b) regions cropped from eye-pair image patches. Note that the non-eye regions may still contain eyes, but they are not very precisely located in the center.

# Eye and Eye-pair Detection



Figure 1: Sample eye-pair regions for training the eye-pair detector.



# Eye and Eye-pair Detection

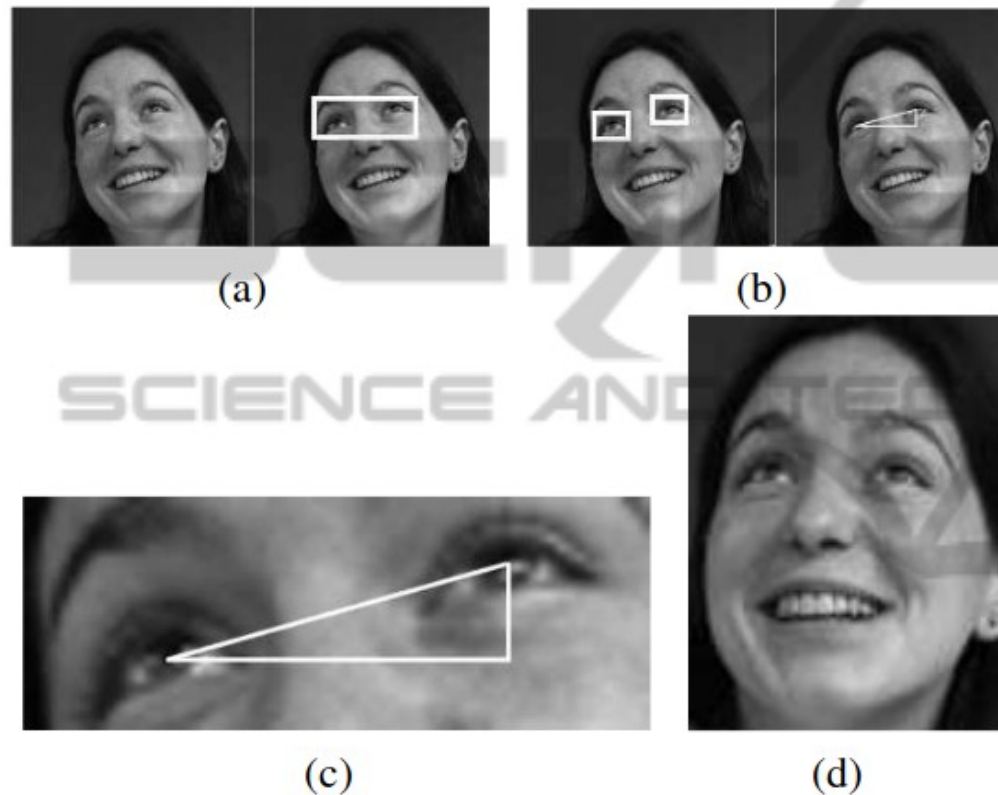
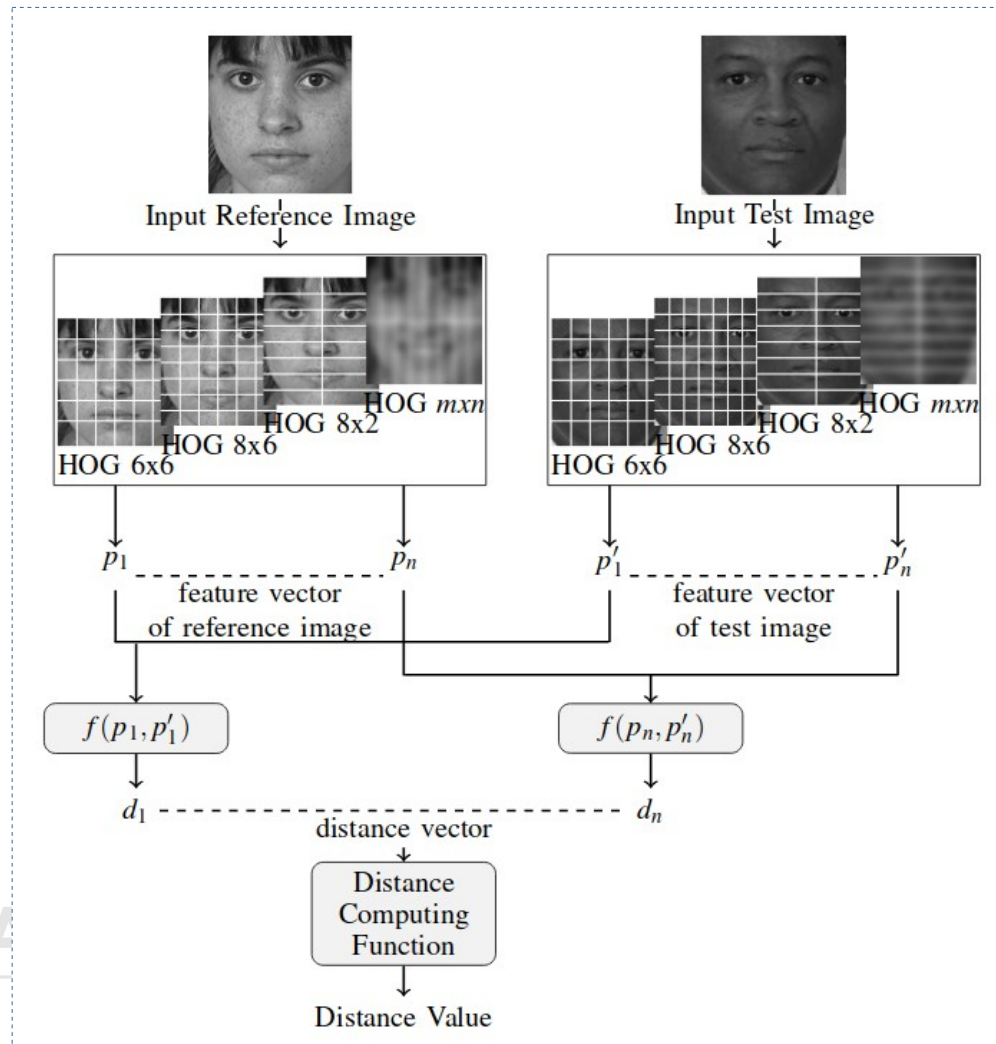
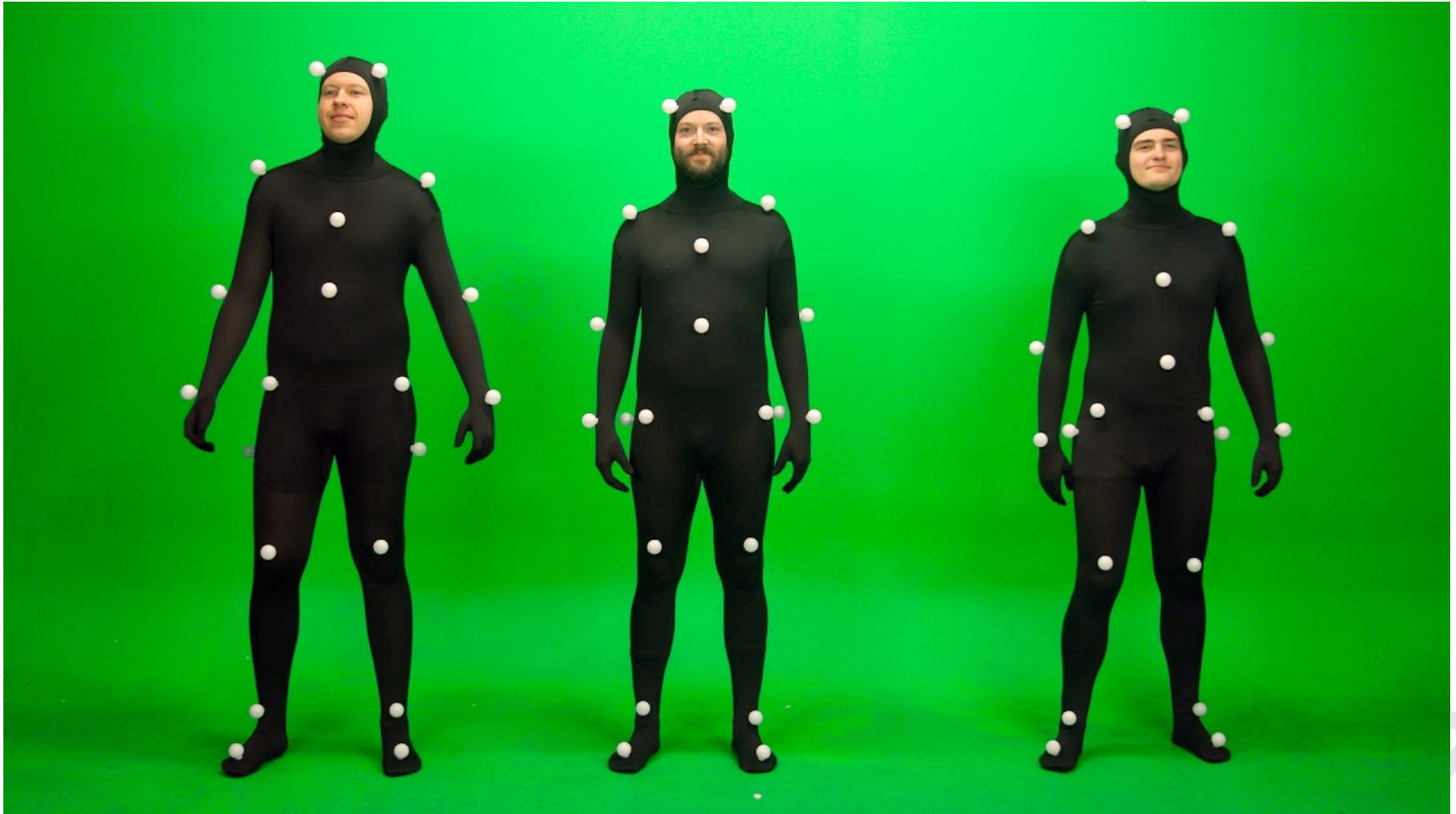


Figure 3: Rotation angle estimation stages: (a) finding eye-pair, (b) finding eyes from eye-pair, (c) computing the angle from central coordinates of eyes ( $17.5^\circ$  in this example), (d) rotationally aligned face.

# Robust Face Recognition



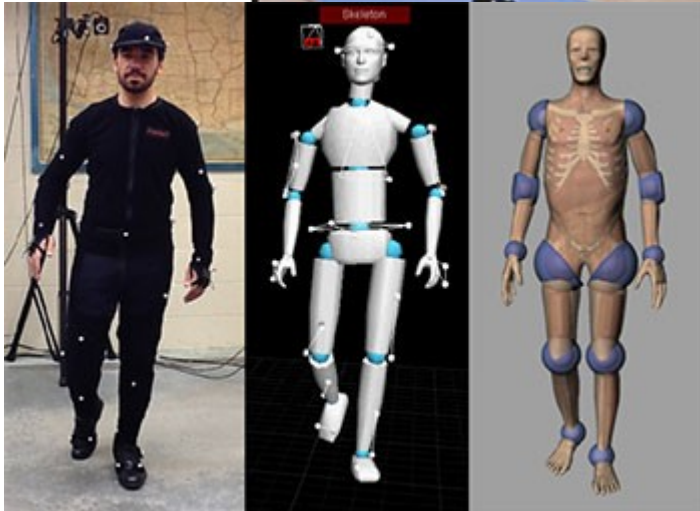
# Motion capture



UNIVERSITY

[https://www.youtube.com/watch?v=kH7msPLVW\\_k](https://www.youtube.com/watch?v=kH7msPLVW_k)

# Motion capture

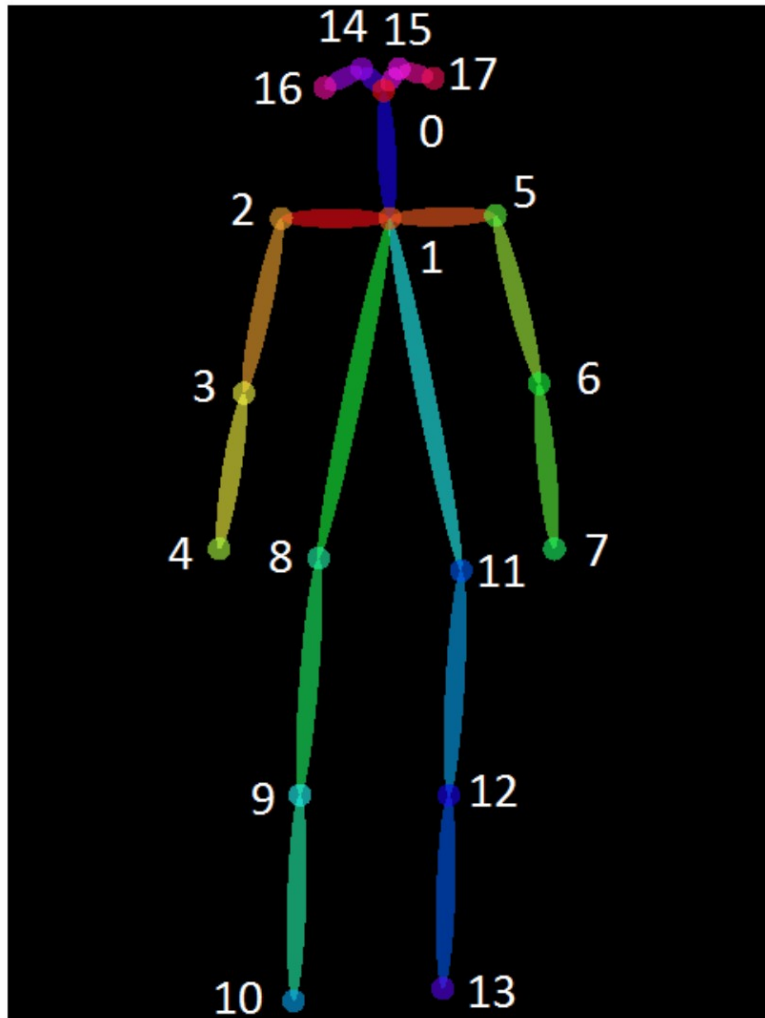


*The Expanded Invasive Weed Optimization Metaheuristic for Solving Continuous and Discrete Optimization Problems*



# Pose Estimation

<https://www.youtube.com/watch?v=KYNDzlcQMWA>



# Pose Estimation

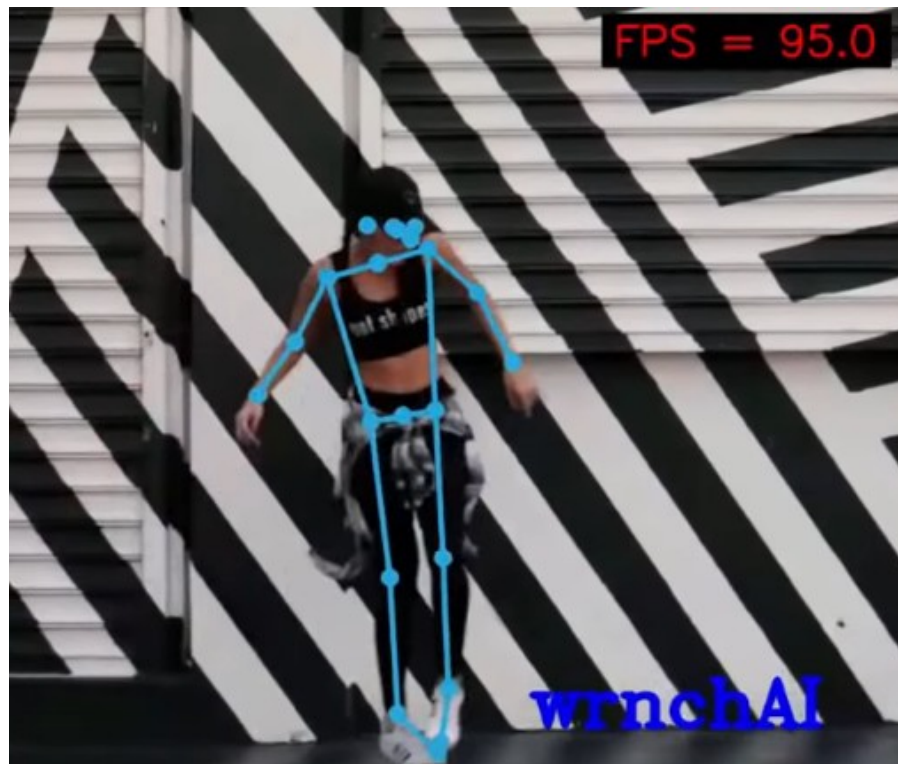
<https://www.youtube.com/watch?v=pW6nZXeWIGM>



UNIVERSITY

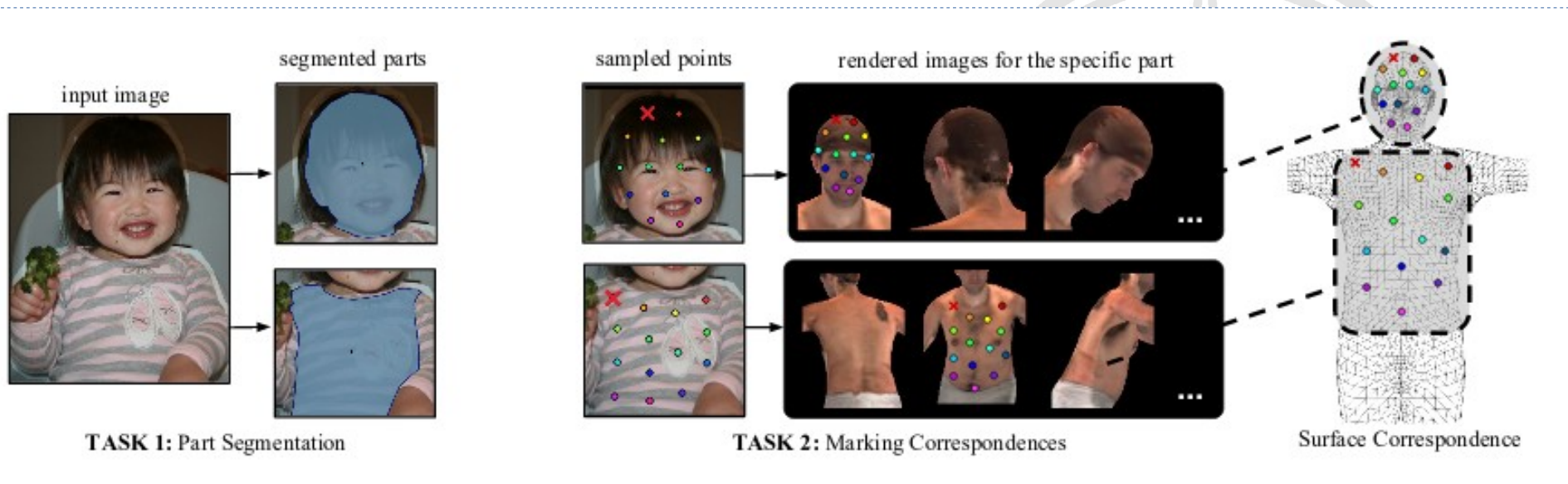
# Pose Estimation

[https://www.youtube.com/watch?v=vTC0QKR\\_uM0](https://www.youtube.com/watch?v=vTC0QKR_uM0)



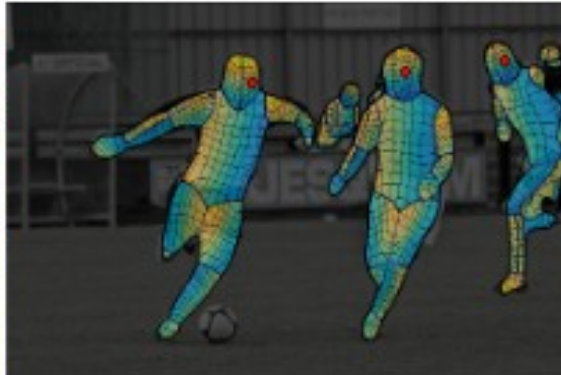


# Dense Human Pose Estimation

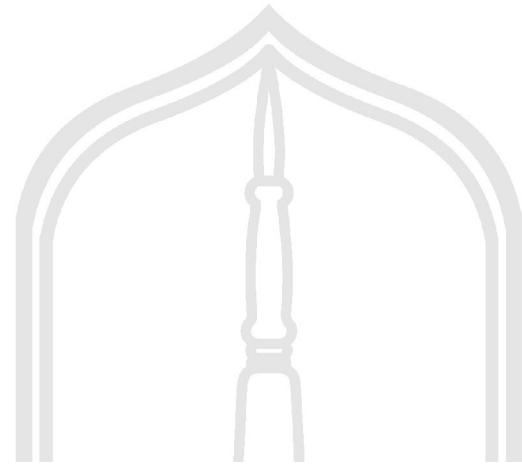




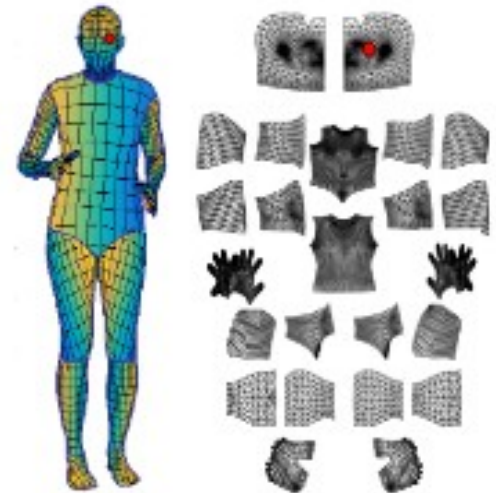
# Dense Human Pose Estimation



DensePose-RCNN Results



DensePose COCO Dataset



MAHASARAKHAM  
UNIVERSITY

# Motion capture



MAHASARAKHAM

<https://www.slashfilm.com/the-morning-watch-the-motion-capture-of-mowgli-why-disney-killed-roger-rabbit-2-more/>

# Motion capture



MAHASARAKHAM  
UNIVERSITY

พูน ปณ ทิต สีเว

<https://srushtivfx.com/how-digital-characters-replicate-human-action-and-emotions-motion-capture/>



# Face Segmentation



UNIVERSITY

มหาวิทยาลัยเทคโนโลยีพระจอมเกล้าธนบุรี

*Deep face segmentation in extremely hard conditions*



# Deep Fake

<https://www.youtube.com/watch?v=knRGxj37AjM>



U N I V E R S I T Y

# Deep Fake



MAHASARAKHAM

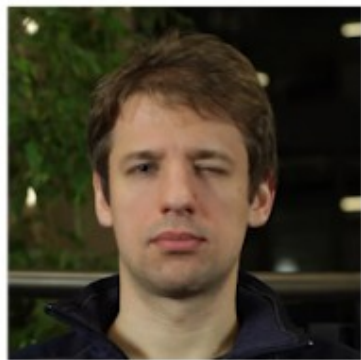
<https://medium.com/datadriveninvestor/facts-in-a-world-of-artificial-intelligence-deepfakes-c073f8791cb6>

# Deep Fake

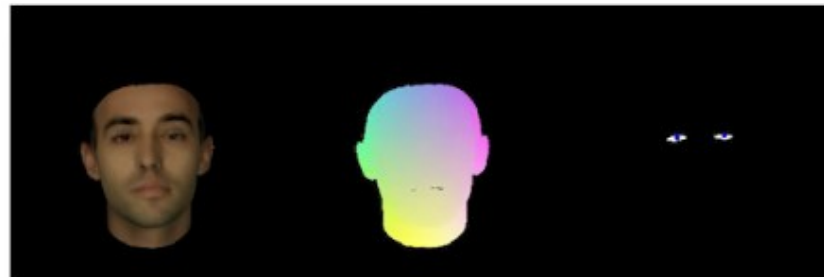
[https://www.youtube.com/watch?time\\_continue=79&v=qc5P2bvfl44](https://www.youtube.com/watch?time_continue=79&v=qc5P2bvfl44)

## Results

### Full Head Reenactment



Source Sequence



Conditioning Images



Result (Target)

# Remove Background using Photoshop





# Remove Background using AI

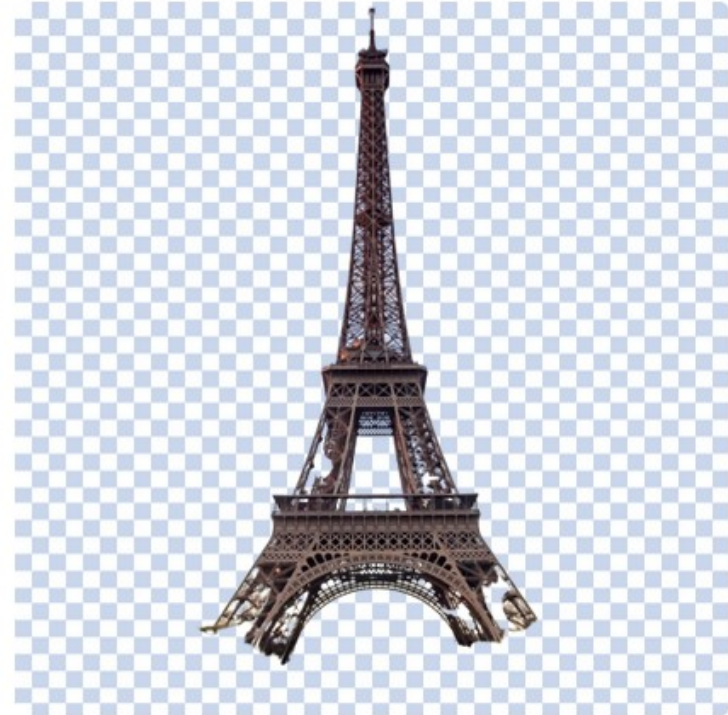


# Remove Background using AI

Original image



Image without background



Download

Edit

Rate this result:





# Remove Background using AI

Original image

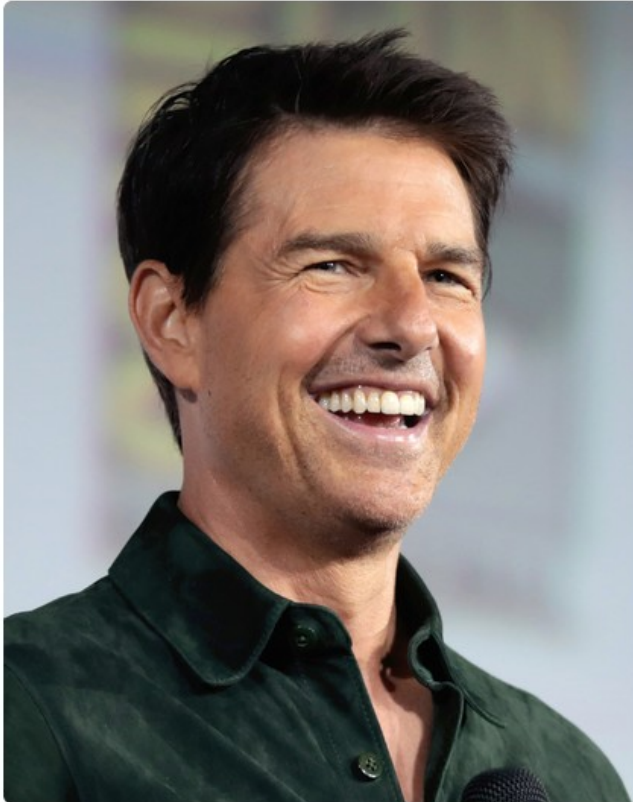
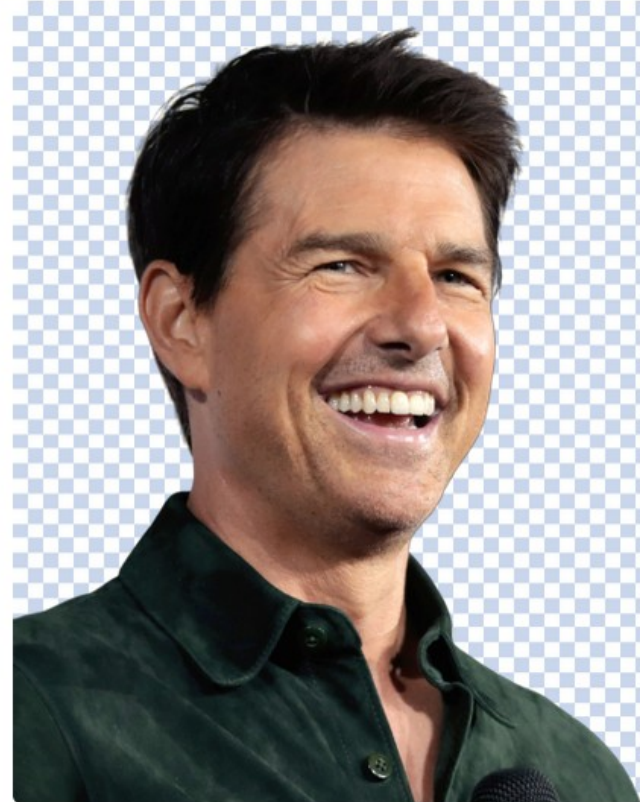


Image without background



Download

Edit

Rate this result: 😊 😞

# Remove Background using AI

Original image



Image without background



 Download

 Edit

Rate this result:





# Remove Background using AI

Original image



Image without background



Download

Edit

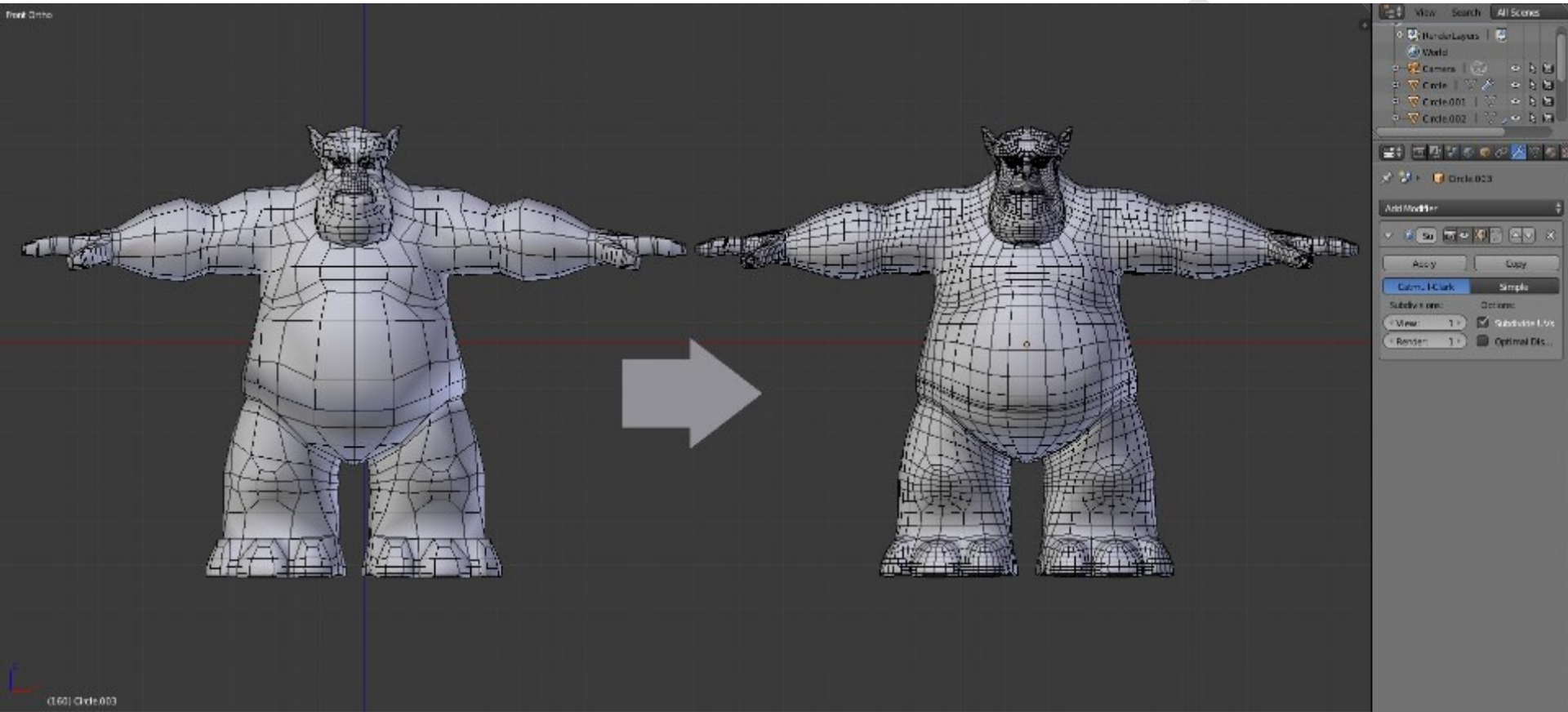
Rate this result:



U N I V E R S I T Y

มหาวิทยาลัยเทคโนโลยี

# 3D Model



MAHASARAKHAM  
UNIVERSITY

พูน ปณ จิต สีเว

# Estimate a detailed body from a single photo

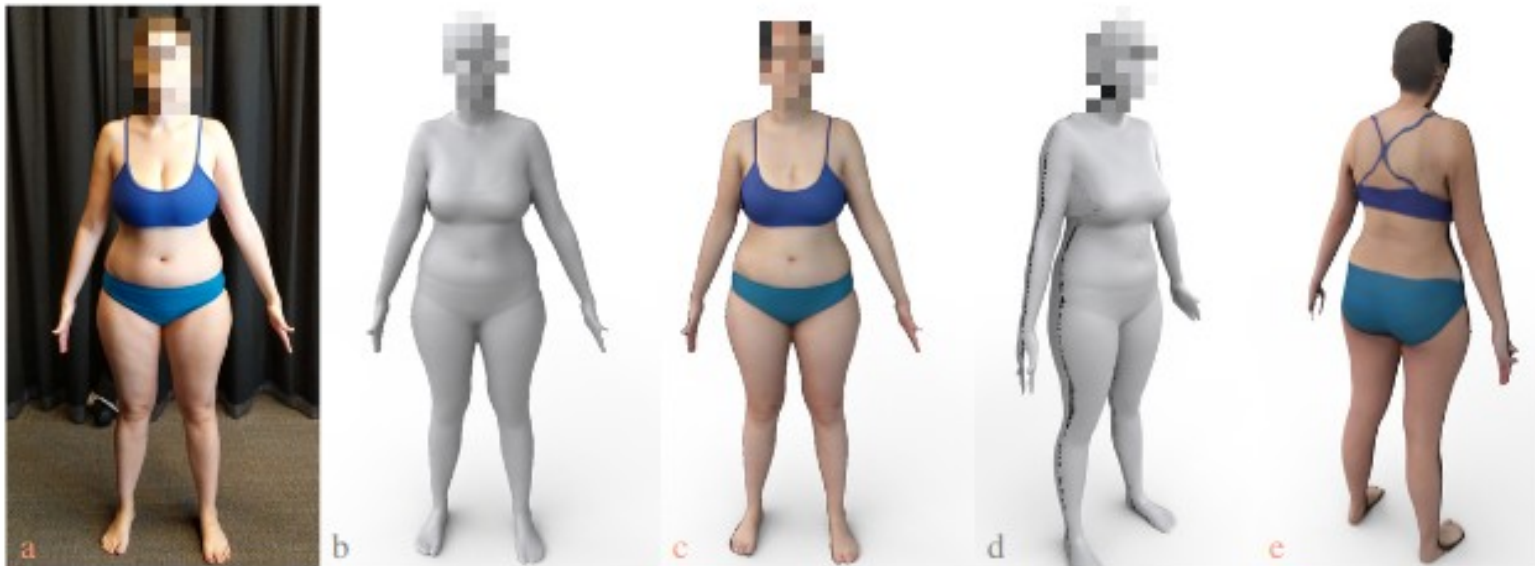
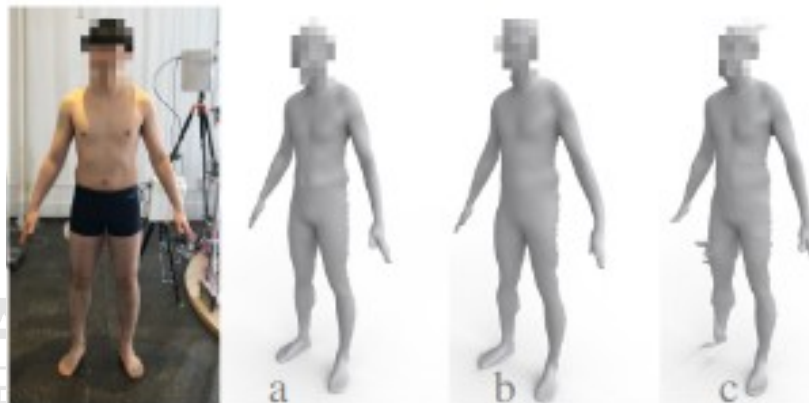
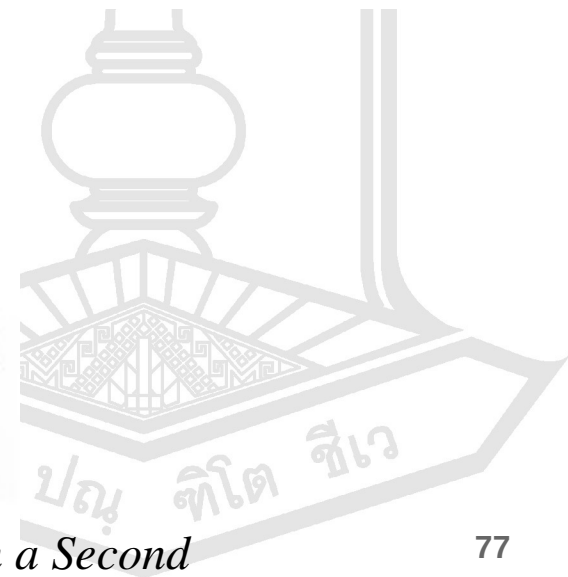


Figure 1: FAX converts a single RGB image (a) into a scan (b, d) with albedo texture (c, e)

# Estimate a detailed body from a single photo

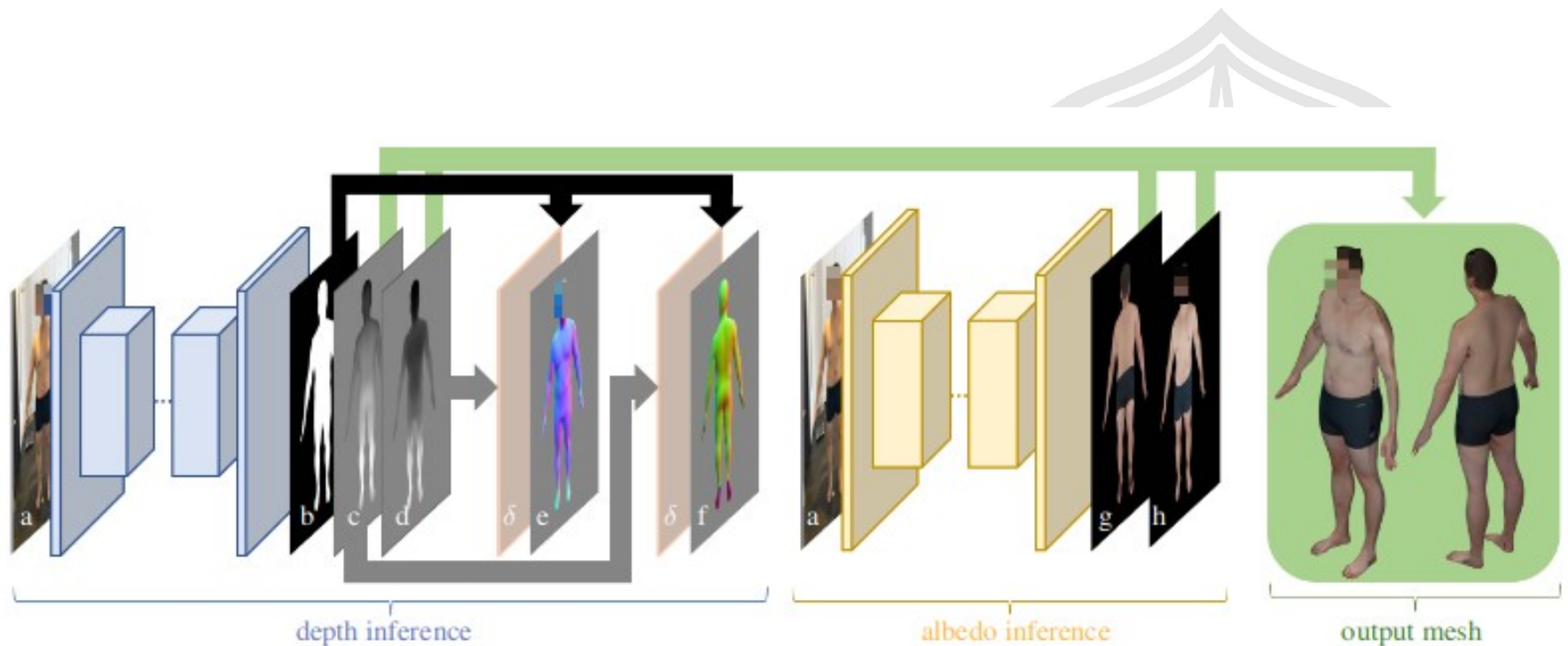


MAHASAKULABODHINTRA  
UNIVERSITY

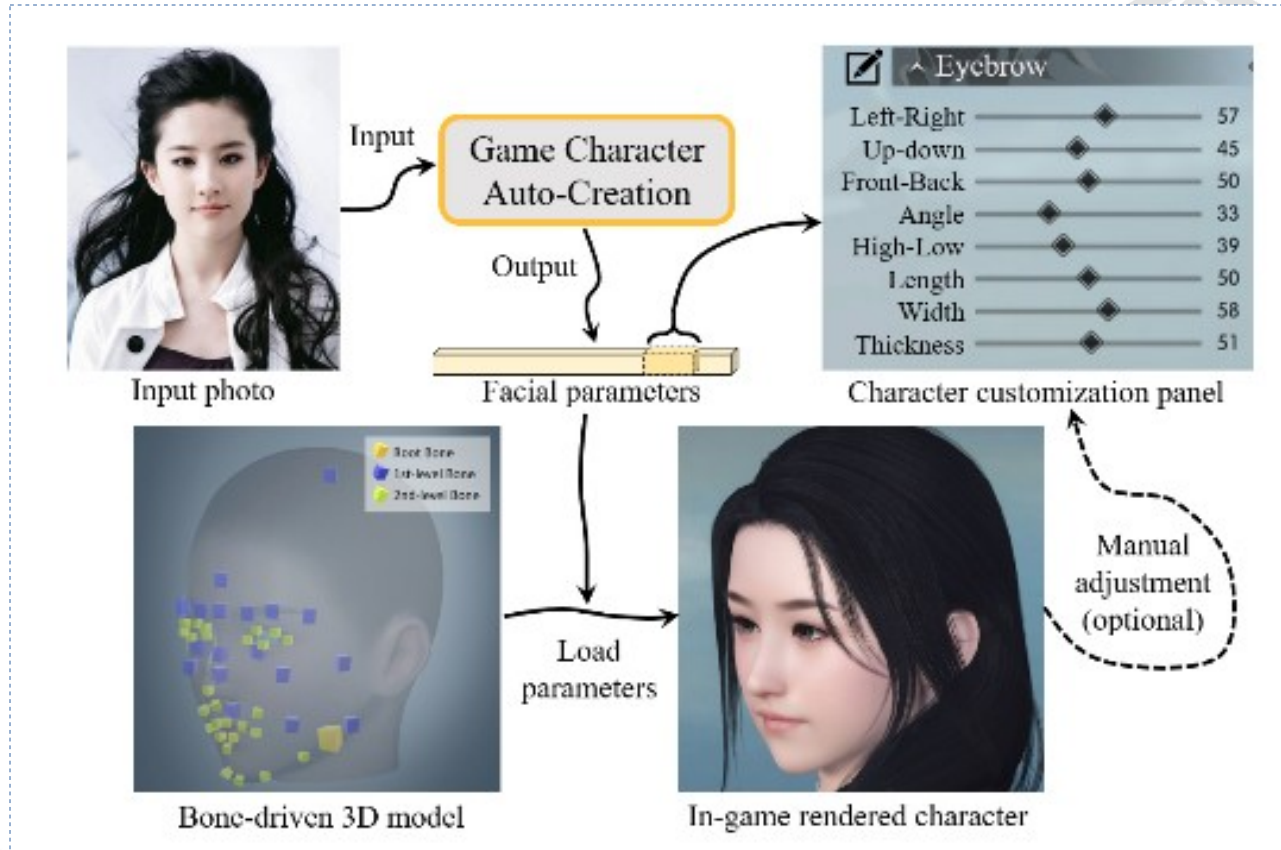




# Estimate a detailed body from a single photo



# Game Character Auto-Creation



# Game Character Auto-Creation

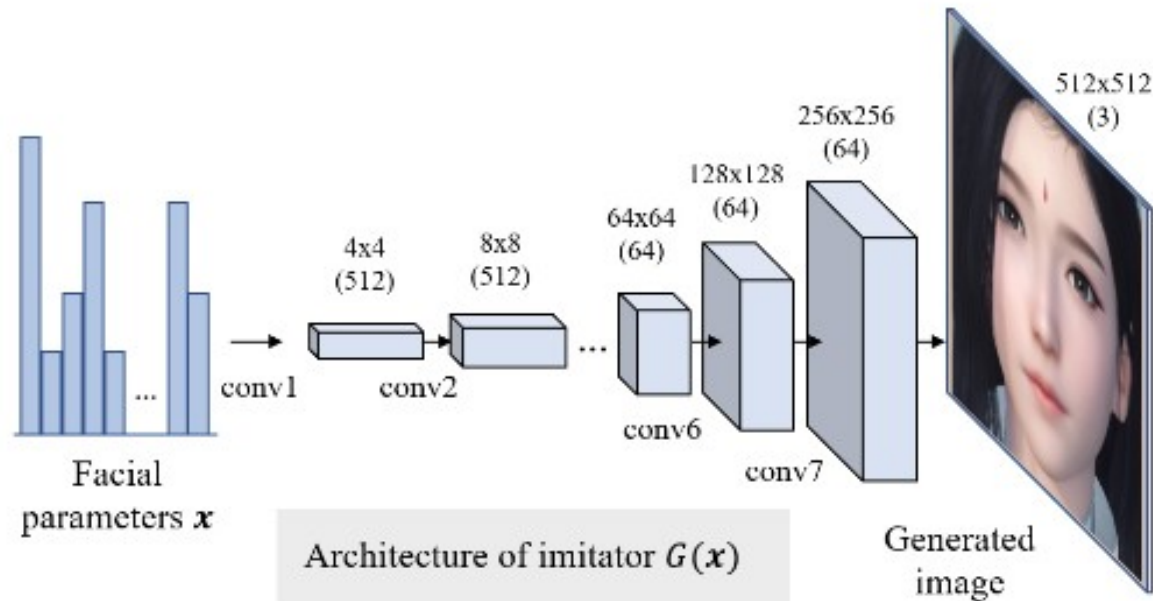


Figure 3. The architecture of our imitator  $G(\mathbf{x})$ . We train the imitator to learn a mapping from the input facial customization parameters  $\mathbf{x}$  to the rendered facial image  $\hat{\mathbf{y}}$  produced by the game engine.

# Game Character Auto-Creation



Input photo

Aligned input

Generated character

Generated in-game  
character (front-view)

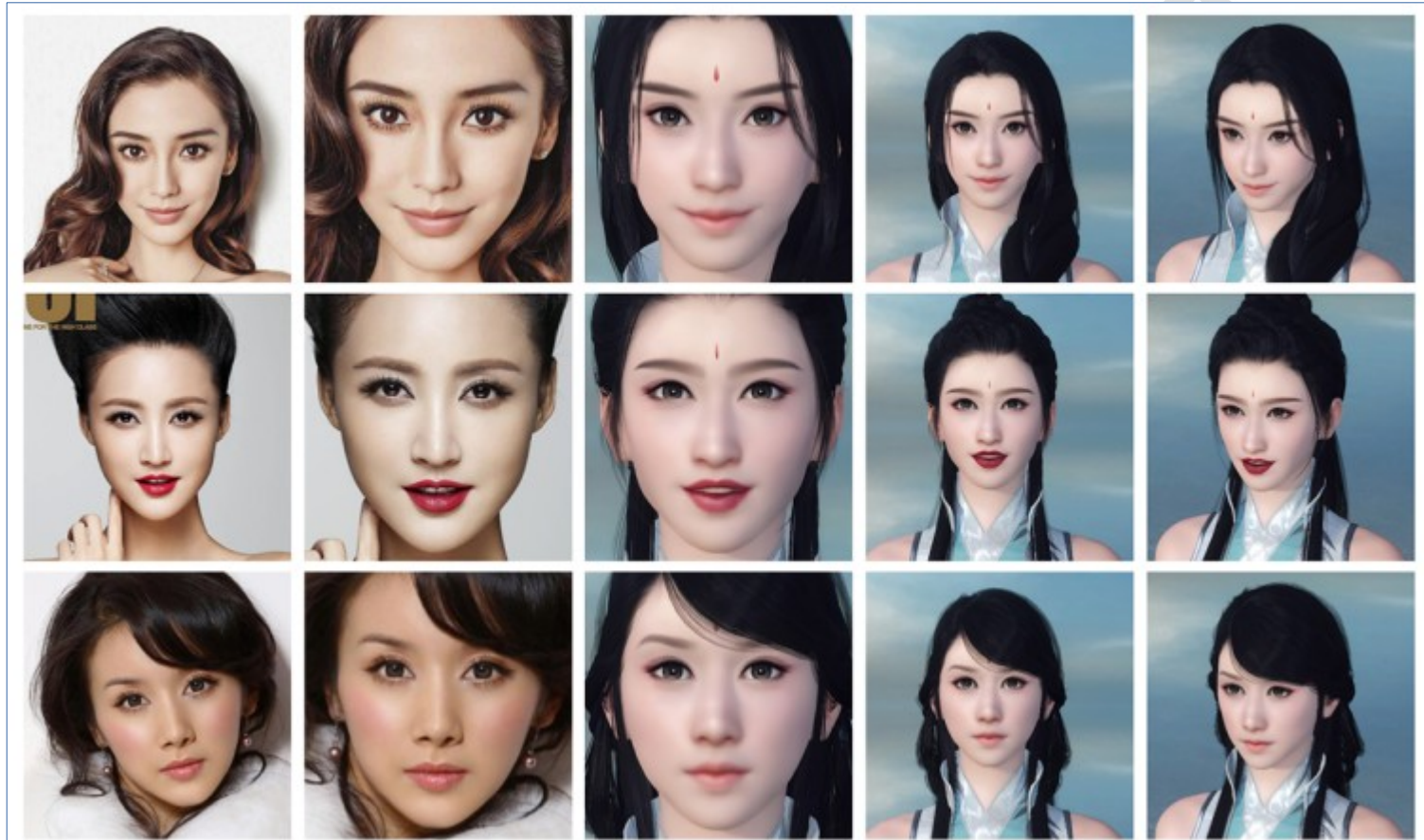
Generated in-game  
character (side-view)

MAHASARAKHAM  
UNIVERSITY

พูน ปณ จิต สีเว



# Game Character Auto-Creation



MAHASARAKHAM  
UNIVERSITY

พูน ปณ จิต สีเว

# Style Transfer GANs

## Generative Adversarial Networks: GANs



MAHASARAKHAM

<https://softologyblog.wordpress.com/2019/03/31/style-transfer-gans-generative-adversarial-networks/>

# Style Transfer



<https://markojerkic.com/style-transfer-keras/>





# Style Transfer GANs





# Style Transfer GANs



MAHASARAKHAM  
UNIVERSITY

<https://markojerkic.com/style-transfer-keras/>

# Style Transfer GANs

---





# Image-to-Image Translation

Zebras ↔ Horses



zebra → horse



horse → zebra

Summer ↔ Winter



summer → winter



winter → summer



Input

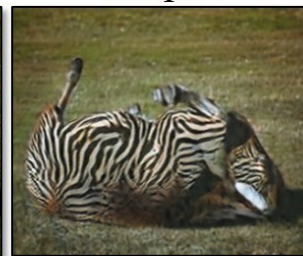
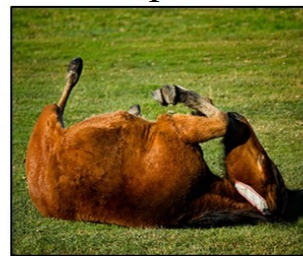
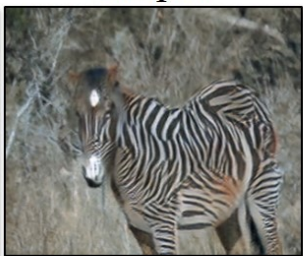
Output

Input

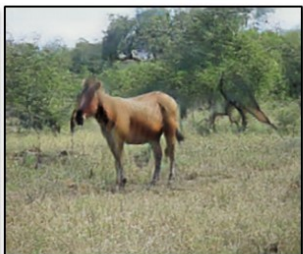
Output

Input

Output



horse → zebra



zebra → horse



apple → orange



orange → apple



# Image-to-Image Translation



Failure case