



# Detecting Art Forgeries Using Machine Learning

Seoho Hahm

# Art Forgery Detection



\$\$\$\$\$\$\$\$\$

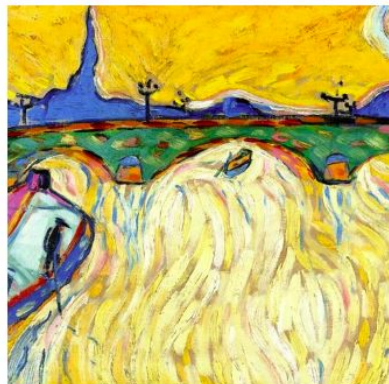
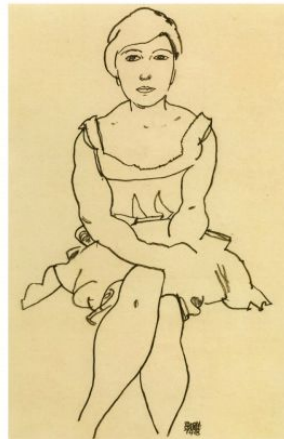
## Past:

- ▣ Relied on human expertise & expensive technology
- ▣ Time consuming & unreliable

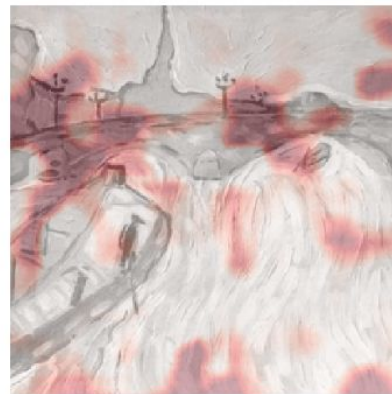
# Machine Learning & Art Forgery

## Present & Future:

- ▣ Machine learning analyzing artists' line/brush strokes
- ▣ More exact & efficient



Beltracchi fake in the style of Max Pechstein



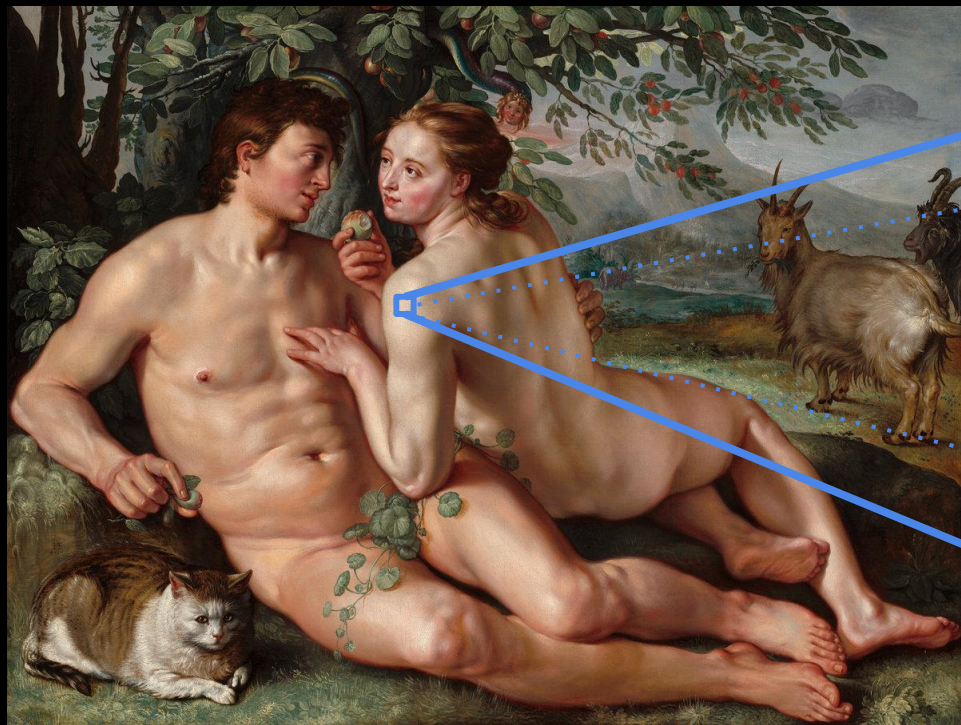
Art Recognition heat map highlighting areas of concern

# This Project: Classifying Craquelure Patterns by Region

*What is craquelure?*

- ▣ Cracks due to old age
- ▣ Different regions (The Netherlands, Italy, France, Belgium, etc.) have different craquelure patterns due to different mediums and materials used





Hendrick Goltzius - The Fall of Man (1616)  
(Dutch)



Flemish



Dutch



# The Data

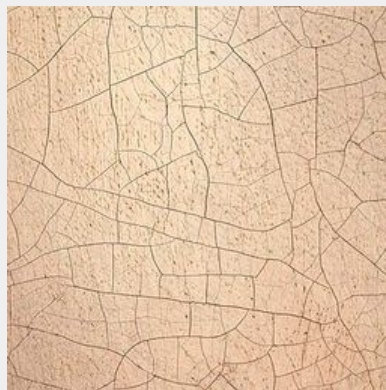
- ▣ Given the time and resource constraints, this project looked specifically at:
  - 17th century
  - Oil paintings on canvas
  - Dutch vs Flemish (Belgian)
  
- ▣ Models based on this data could test whether a painting claiming to be a 17th c. Dutch/Flemish is indeed from then and there

# Crop of craquelure (256 x 256 px)

grayscale

color

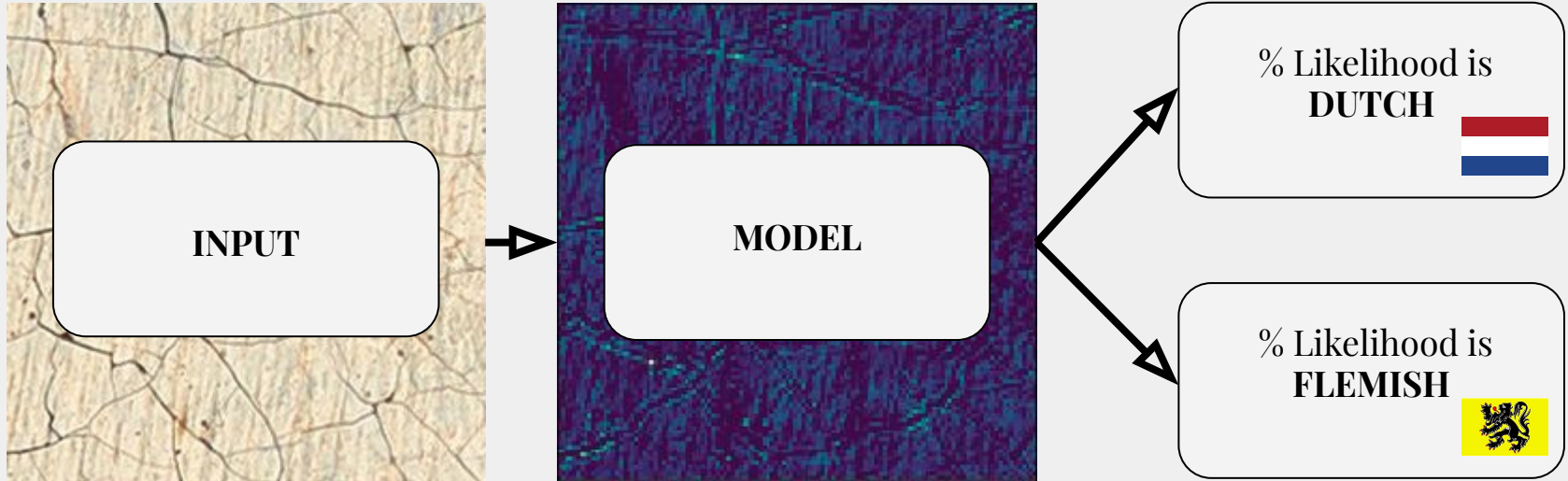
black & white



Source: National Gallery of Art



# Process



# Model Performance

	Grayscale	Color	B&W
Training Accuracy	~ 100%	~ 97%	~ 92%
Validation Accuracy	~ 67%	~ 83%	~ 61%
Test Accuracy	~ 65%	~ 79%	TBD

## Limitations & Future Directions

- Small & biased dataset
- Need automated methods for:
  - Collecting the craquelure images
  - Standardizing/scaling the images
- Expand model to classify more regions and centuries

*Thank you!*  
**Any questions?**

You can find me at  
Github: seoho926  
seoho.h@gmail.com

# APPENDIX



Model: "sequential\_1"

Layer (type)	Output Shape	Param #
conv2d_1 (Conv2D)	(None, 124, 124, 10)	3010
max_pooling2d_1 (MaxPooling2D)	(None, 12, 12, 10)	0
conv2d_2 (Conv2D)	(None, 4, 4, 10)	2510
max_pooling2d_2 (MaxPooling2D)	(None, 1, 1, 10)	0
conv2d_3 (Conv2D)	(None, 1, 1, 10)	110
average_pooling2d_1 (AveragePooling2D)	(None, 1, 1, 10)	0
flatten_1 (Flatten)	(None, 10)	0
dense_1 (Dense)	(None, 20)	220
dense_2 (Dense)	(None, 100)	2100
dense_3 (Dense)	(None, 200)	20200
dense_4 (Dense)	(None, 1)	201
Total params: 28,351		
Trainable params: 28,351		
Non-trainable params: 0		

## Summary of Convolution Neural Network (CNN) Color Model