

6131881421 YOSCHANIN PULSIRIVONG

Clothing Classification and Recommendation

2143488.i Big Data and Artificial Intelligence (ICE)

Goals

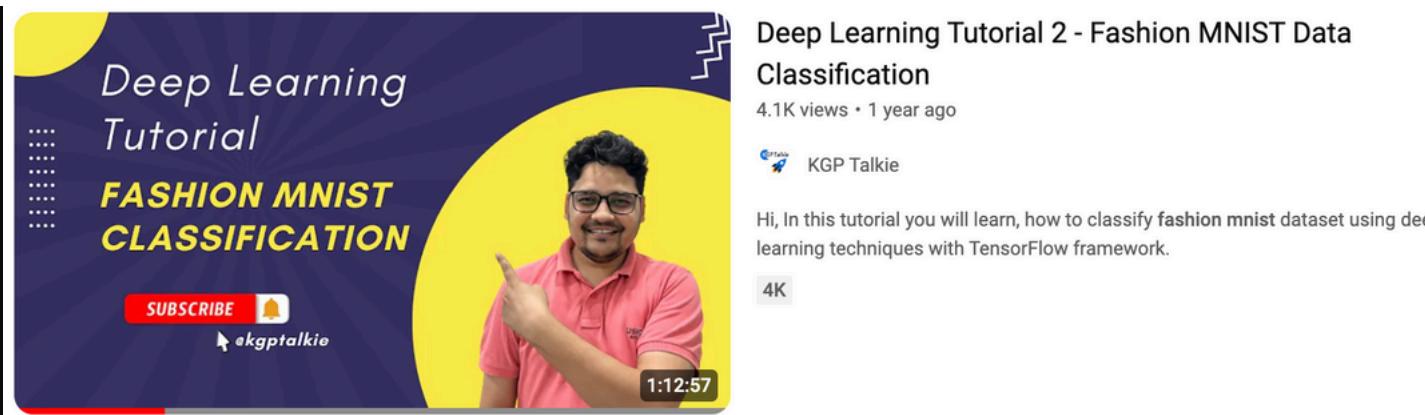
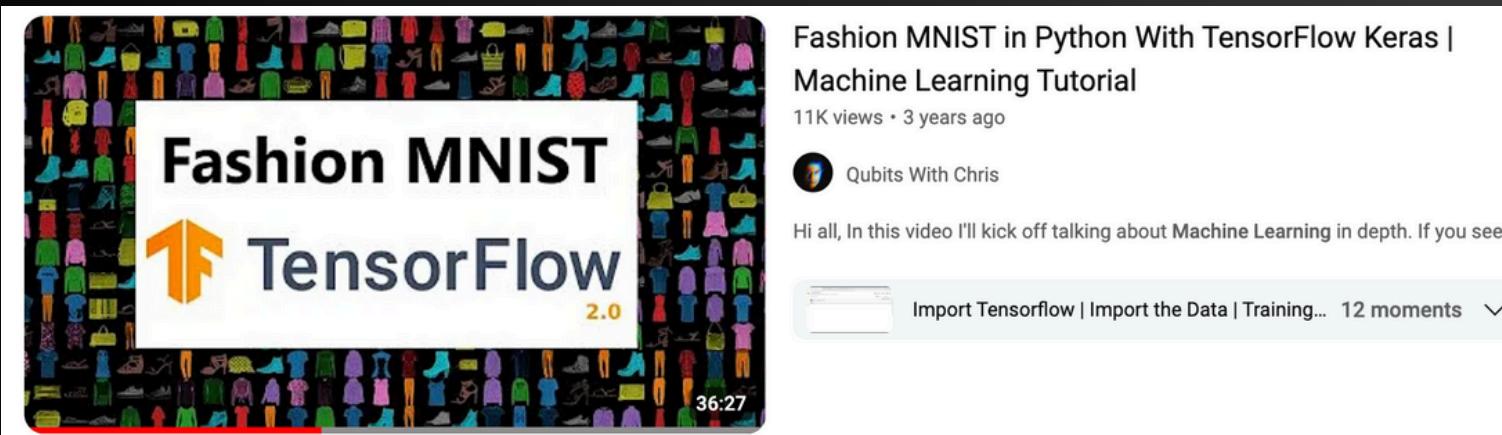
What I aim to achieve

- Train with live data or data from Kaggle
- Get live photos from webcam device
- Successful clothing classification
- Successful clothing segmentation
- Computer vision (Image-to-Text)
- Filter our profanity
- Recommendation

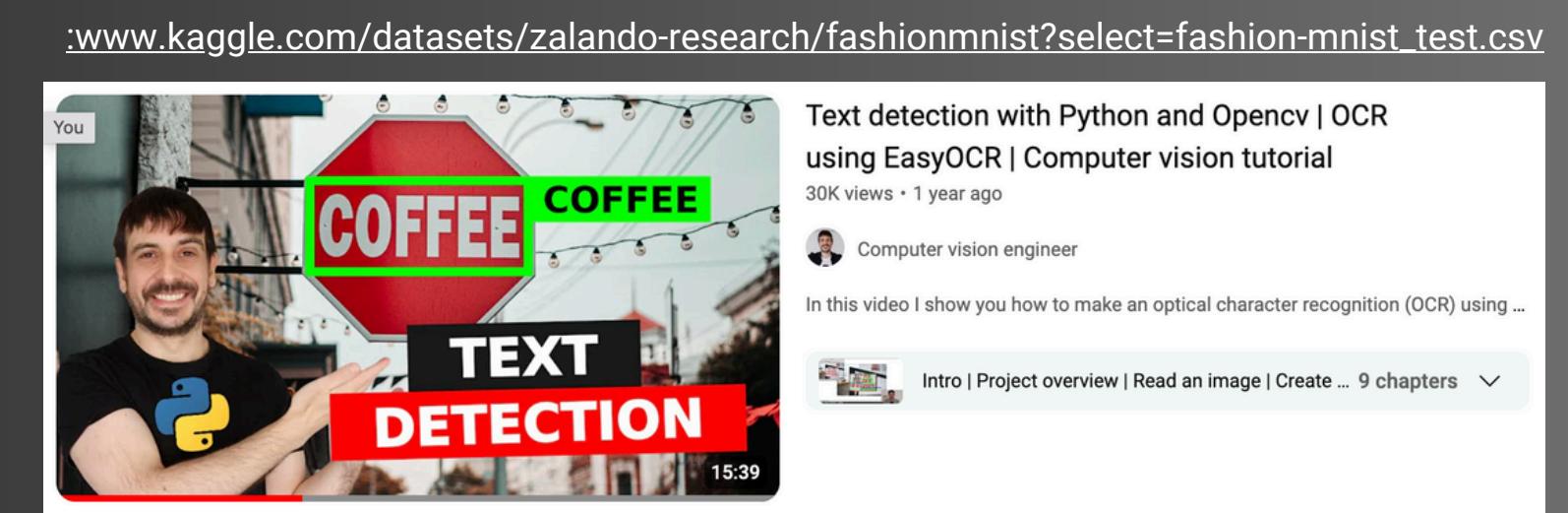
```
state={  
  products: storeProduct  
}  
  
render() {  
  return (  
    <React.Fragment>  
      <div className="App">  
        <div className="App-header">  
          <Title>Clothing Classifier</Title>  
          <div>  
            <Form>  
              <Input type="text" placeholder="Upload Photo" />  
              <Button type="button">Upload</Button>  
            </Form>  
            <div>  
              <ImagePreview />  
            </div>  
            <Text>Clothing Classification</Text>  
            <Text>Clothing Segmentation</Text>  
            <Text>Computer Vision</Text>  
            <Text>Profanity Filter</Text>  
            <Text>Recommendation</Text>  
          </div>  
        </div>  
      </div>  
    </React.Fragment>  
  )  
}  
export default App
```

Research and Guides

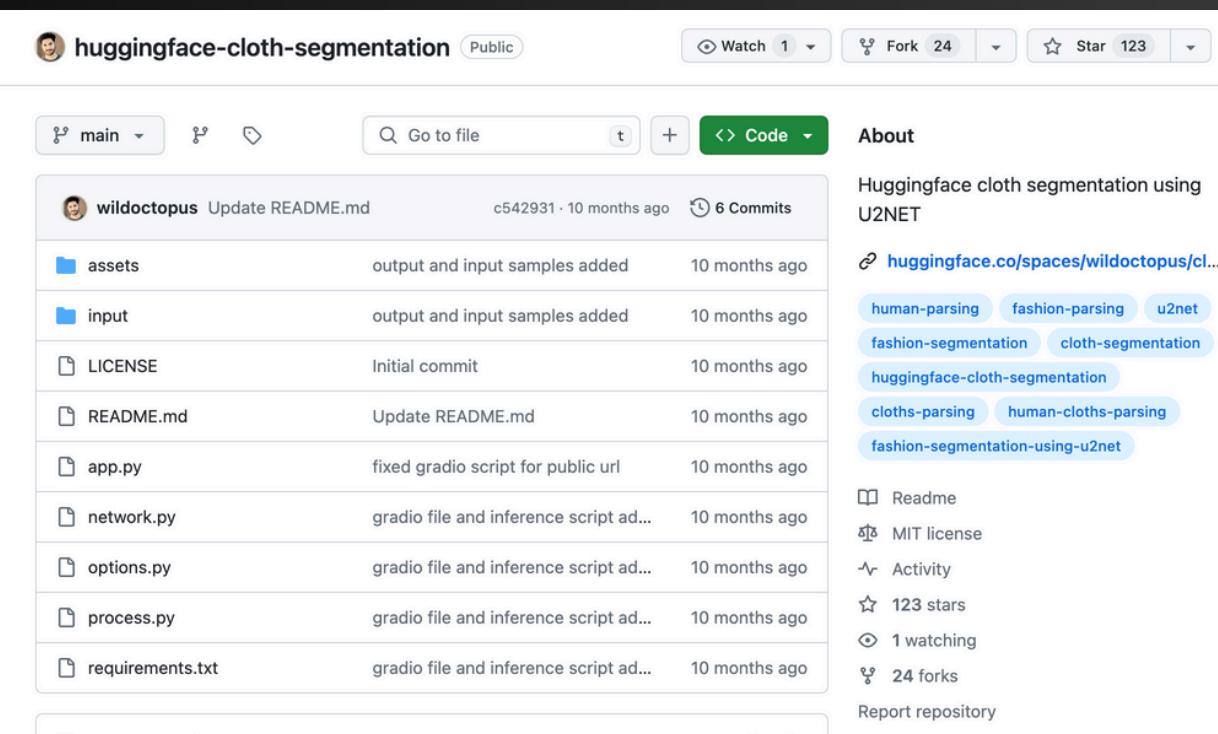
Useful materials...



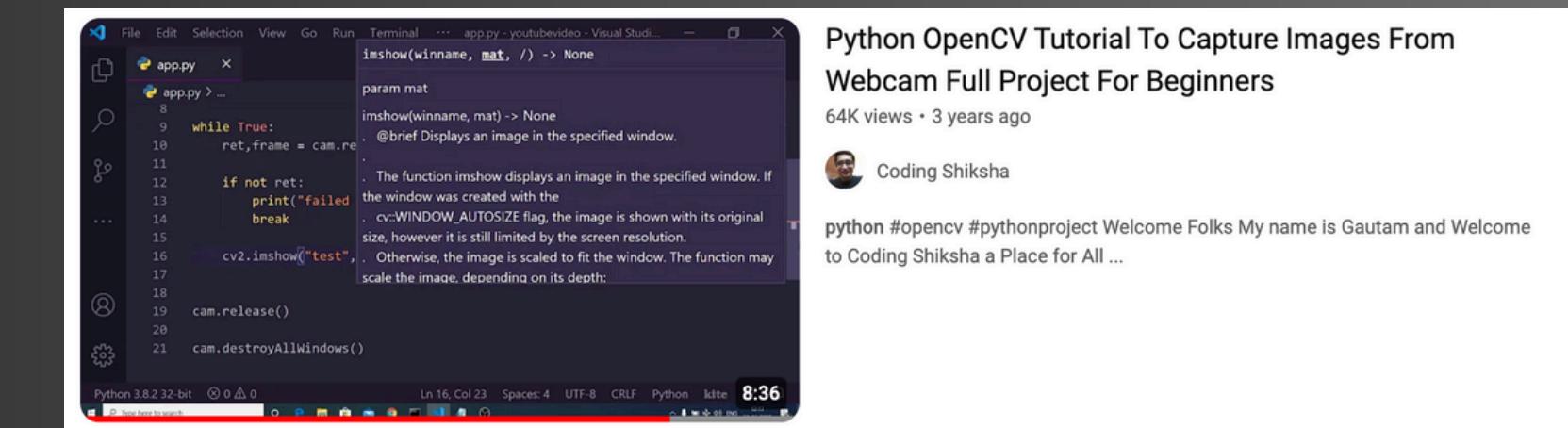
<https://www.youtube.com/watch?v=KDUnfk14aGk>
<https://www.youtube.com/watch?v=wSmI2fEFuzs&t=944s>



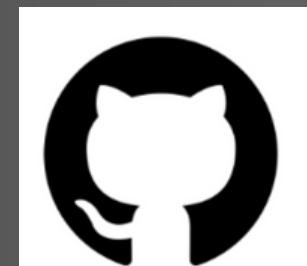
<https://www.youtube.com/watch?v=n-8oCPjpEvM&t=325s>



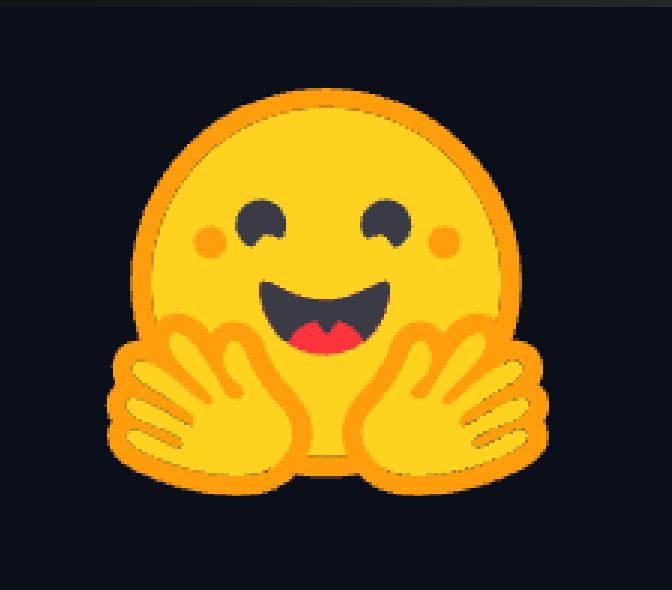
<https://github.com/wilddoctopus/huggingface-cloth-segmentation>



<https://www.youtube.com/watch?v=lhRfqjC29Ds&t=424s>



Install & Import Dependencies



```
import numpy as np
import matplotlib.pyplot as plt
import tensorflow as tf
from keras.utils import to_categorical
from skimage import io
import csv
import os
from PIL import Image
import pandas as pd
import cv2
from IPython.display import Image
import pytesseract as pyt
import easyocr
from better_profanity import profanity
```

Taking the Photo



```
folder_path = "/Users/chae/Desktop/BigDataProj/input"
if not os.path.exists(folder_path):
    os.makedirs(folder_path)

cam = cv2.VideoCapture(0)
cv2.namedWindow("Clothing Recommendation Machine")
img_counter = 0

while True:
    ret, frame = cam.read()
    if not ret:
        print("failed to grab frame")
        break
    cv2.imshow("test", frame)
    k = cv2.waitKey(1)
    if k%256 == 27:
        print("Escape hit, closing...")
        break
    elif k%256 == 32:
        img_name = os.path.join(folder_path, "opencv_frame_{}.png".format(img_counter))
        cv2.imwrite(img_name, frame)
        print("Screenshot Taken")
        img_counter += 1

cam.release()
cv2.destroyAllWindows()
```

‘Spacebar’ to take image
‘esc’ to close

Handling Data

```
(x_train, y_train), (x_test, y_test) = tf.keras.datasets.fashion_mnist.load_data()
train_indices = np.where(y_train != 8)
test_indices = np.where(y_test != 8)

x_train_filtered, y_train_filtered = x_train[train_indices], y_train[train_indices]
x_test_filtered, y_test_filtered = x_test[test_indices], y_test[test_indices]

x_train = x_train / 255
x_test = x_test / 255

model = tf.keras.models.Sequential([
    tf.keras.layers.Flatten(input_shape=(28, 28, 1)),
    tf.keras.layers.Dense(128, activation='relu'),
    tf.keras.layers.Dense(10, activation='softmax')
])
```

- First model...

Handling Data

- Second model...

```
(x_train, y_train), (x_test, y_test) = tf.keras.datasets.fashion_mnist.load_data()
train_indices = np.where(y_train != 8)
test_indices = np.where(y_test != 8)

x_train_filtered, y_train_filtered = x_train[train_indices], y_train[train_indices]
x_test_filtered, y_test_filtered = x_test[test_indices], y_test[test_indices]

x_train = x_train / 255
x_test = x_test / 255

model = tf.keras.models.Sequential([
    tf.keras.layers.Flatten(input_shape=(28, 28, 1)),
    tf.keras.layers.Dense(128, activation='relu'),
    tf.keras.layers.Dense(10, activation='softmax')
])
```

```
import tensorflow as tf

model = tf.keras.models.Sequential([
    tf.keras.layers.Conv2D(32, (3, 3), activation='relu', input_shape=(28, 28, 1)),
    tf.keras.layers.MaxPooling2D((2, 2)),
    tf.keras.layers.Conv2D(64, (3, 3), activation='relu'),
    tf.keras.layers.MaxPooling2D((2, 2)),
    tf.keras.layers.Conv2D(64, (3, 3), activation='relu'),
    tf.keras.layers.Flatten(),
    tf.keras.layers.Dense(64, activation='relu'),
    tf.keras.layers.Dense(10, activation='softmax')
])

/Library/Frameworks/Python.framework/Versions/3.12/lib/python3.12/site-packages/keras/src/layers/convolutional/base_conv.py:99: UserWarning: Do not pass an `input_shape`/`input_dim` argument to a layer. When using Sequential models, prefer using an `Input(shape)` object as the first layer in the model instead.
    super().__init__(
```

Compiling and Training Model

```
y_train_one_hot_filtered = to_categorical(y_train_filtered)
model.compile(optimizer='adam', loss='categorical_crossentropy', metrics=['accuracy'])
model.fit(x_train_filtered, y_train_one_hot_filtered, epochs=10)

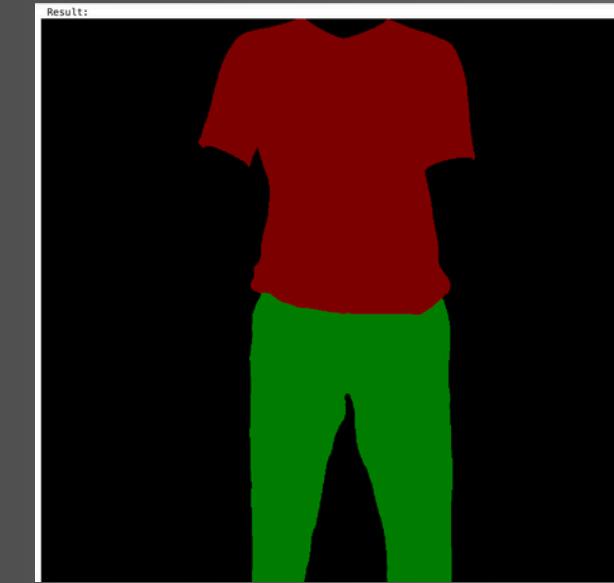
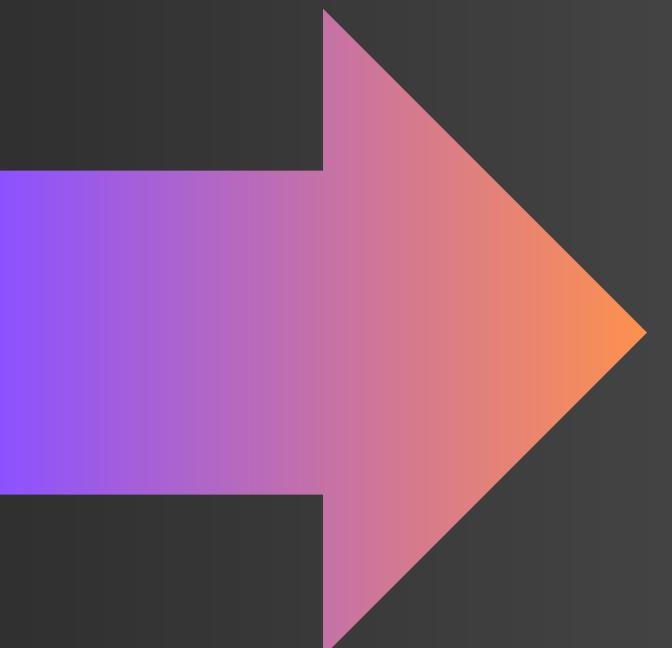
-----
Epoch 3/10
1688/1688 1s 698us/step - accuracy: 0.8414 - loss: 0.4599
Epoch 4/10
1688/1688 1s 738us/step - accuracy: 0.8387 - loss: 0.4672
Epoch 5/10
1688/1688 1s 818us/step - accuracy: 0.8430 - loss: 0.4561
Epoch 6/10
1688/1688 1s 750us/step - accuracy: 0.8433 - loss: 0.4532
Epoch 7/10
1688/1688 1s 742us/step - accuracy: 0.8465 - loss: 0.4482
Epoch 8/10
1688/1688 1s 759us/step - accuracy: 0.8437 - loss: 0.4536
Epoch 9/10
1688/1688 1s 823us/step - accuracy: 0.8447 - loss: 0.4619
Epoch 10/10
1688/1688 1s 723us/step - accuracy: 0.8459 - loss: 0.4575
<keras.src.callbacks.history.History at 0x34f56c200>
```

```
y_train_one_hot_filtered = to_categorical(y_train_filtered)
model.compile(optimizer='adam', loss='categorical_crossentropy', metrics=['accuracy'])
model.fit(x_train_filtered, y_train_one_hot_filtered, epochs=10)

-----
Epoch 1/10
1688/1688 13s 7ms/step - accuracy: 0.7544 - loss: 0.8650
Epoch 2/10
1688/1688 12s 7ms/step - accuracy: 0.8694 - loss: 0.3539
Epoch 3/10
1688/1688 12s 7ms/step - accuracy: 0.8843 - loss: 0.3060
Epoch 4/10
1688/1688 12s 7ms/step - accuracy: 0.8955 - loss: 0.2824
Epoch 5/10
1688/1688 12s 7ms/step - accuracy: 0.9051 - loss: 0.2574
Epoch 6/10
1688/1688 13s 8ms/step - accuracy: 0.9060 - loss: 0.2485
Epoch 7/10
1688/1688 13s 8ms/step - accuracy: 0.9143 - loss: 0.2282
Epoch 8/10
1688/1688 13s 8ms/step - accuracy: 0.9168 - loss: 0.2157
Epoch 9/10
1688/1688 13s 7ms/step - accuracy: 0.9232 - loss: 0.2014
```

Clothing Segmentation

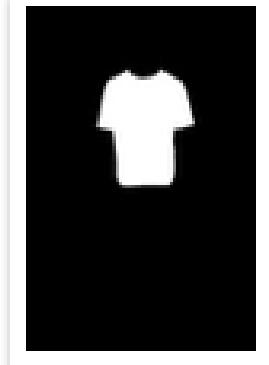
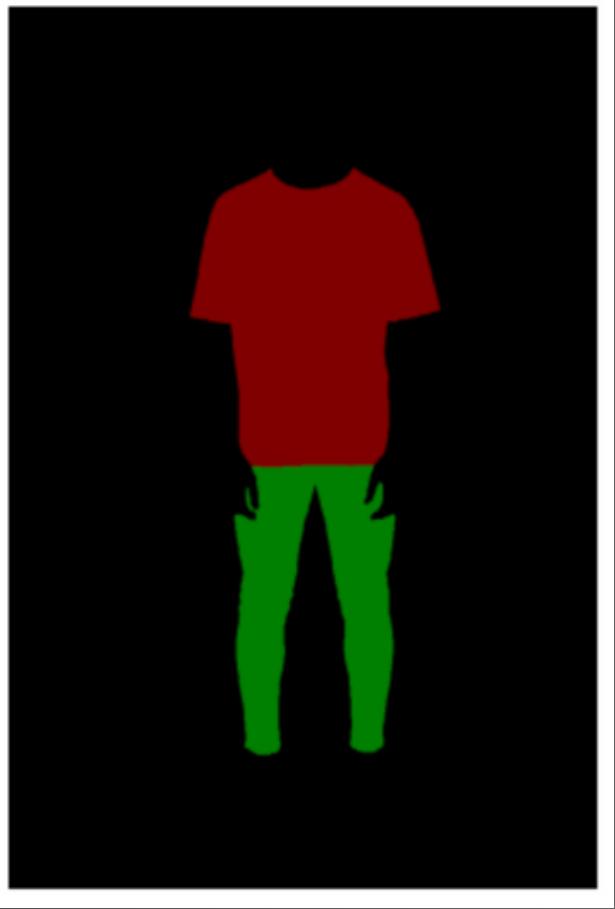
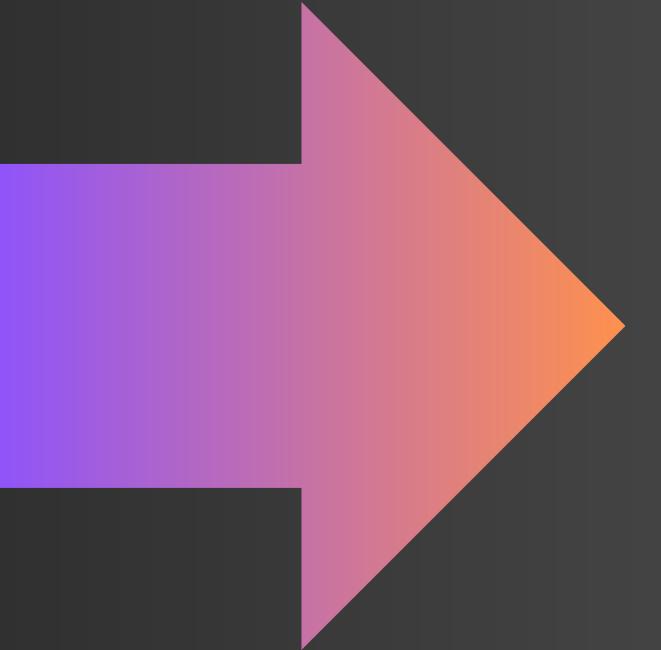
```
!python3 process.py --image '/Users/chae/Desktop/BigDataProj/input/Screenshot 2024-05-05 at 17.59.2  
Model already exists.  
----checkpoints loaded from path: model/cloth_segm.pth----  
[W NNPACK.cpp:53] Could not initialize NNPACK! Reason: Unsupported hardware.  
/usr/local/lib/python3.7/site-packages/torch/nn/functional.py:3734: UserWarning: nn.functional.upsample is deprecated. Use nn.functional.interpolate instead.  
    warnings.warn("nn.functional.upsample is deprecated. Use nn.functional.interpolate instead.")  
  
import matplotlib.pyplot as plt  
import matplotlib.image as mpimg  
  
# Load the image  
img = mpimg.imread('/Users/chae/Desktop/BigDataProj/output/cloth_seg/final_seg.png')  
  
# Display the image  
plt.imshow(img)  
plt.axis('off')  
plt.show()
```



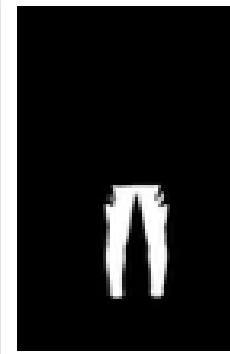
1.png

2.png

Clothing Segmentation

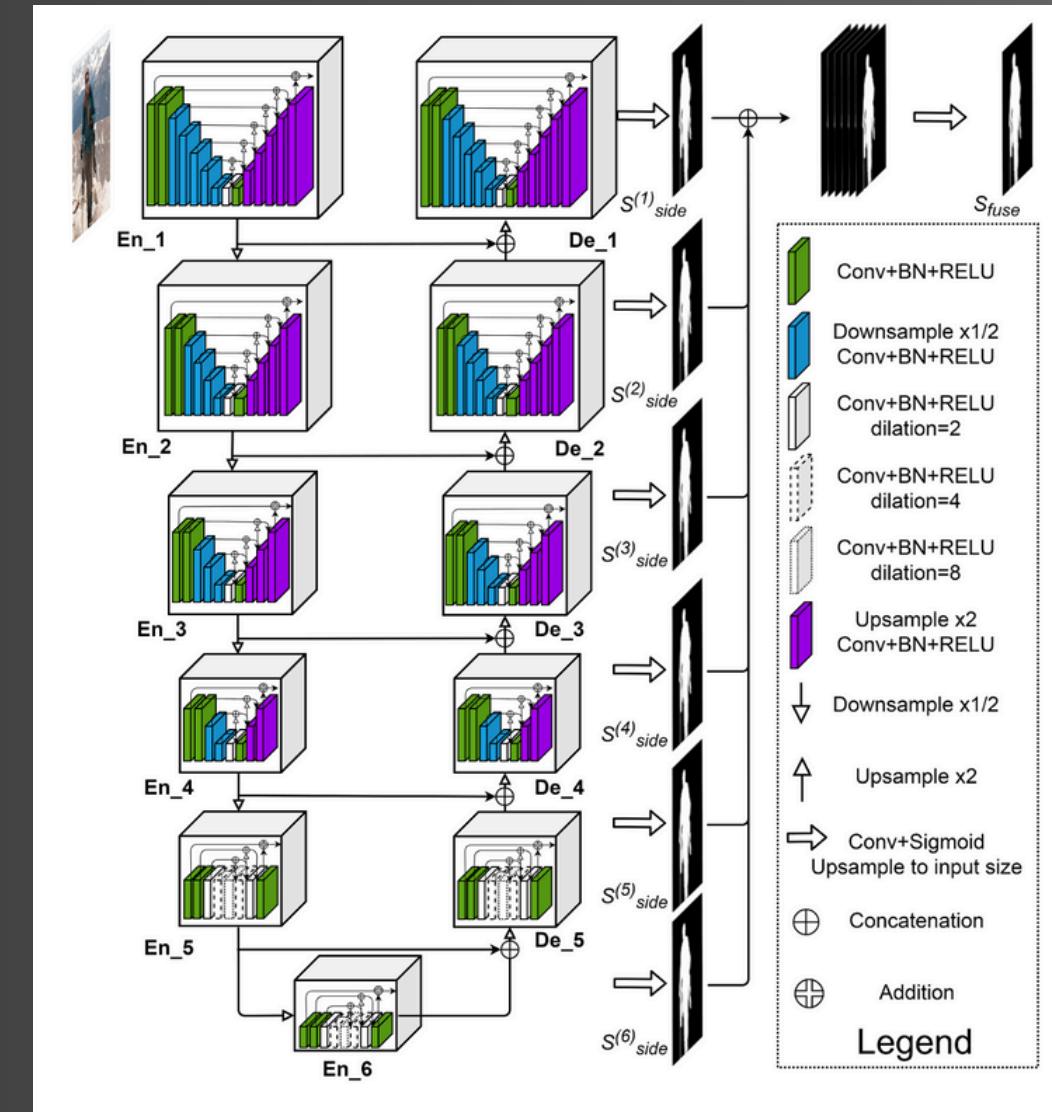
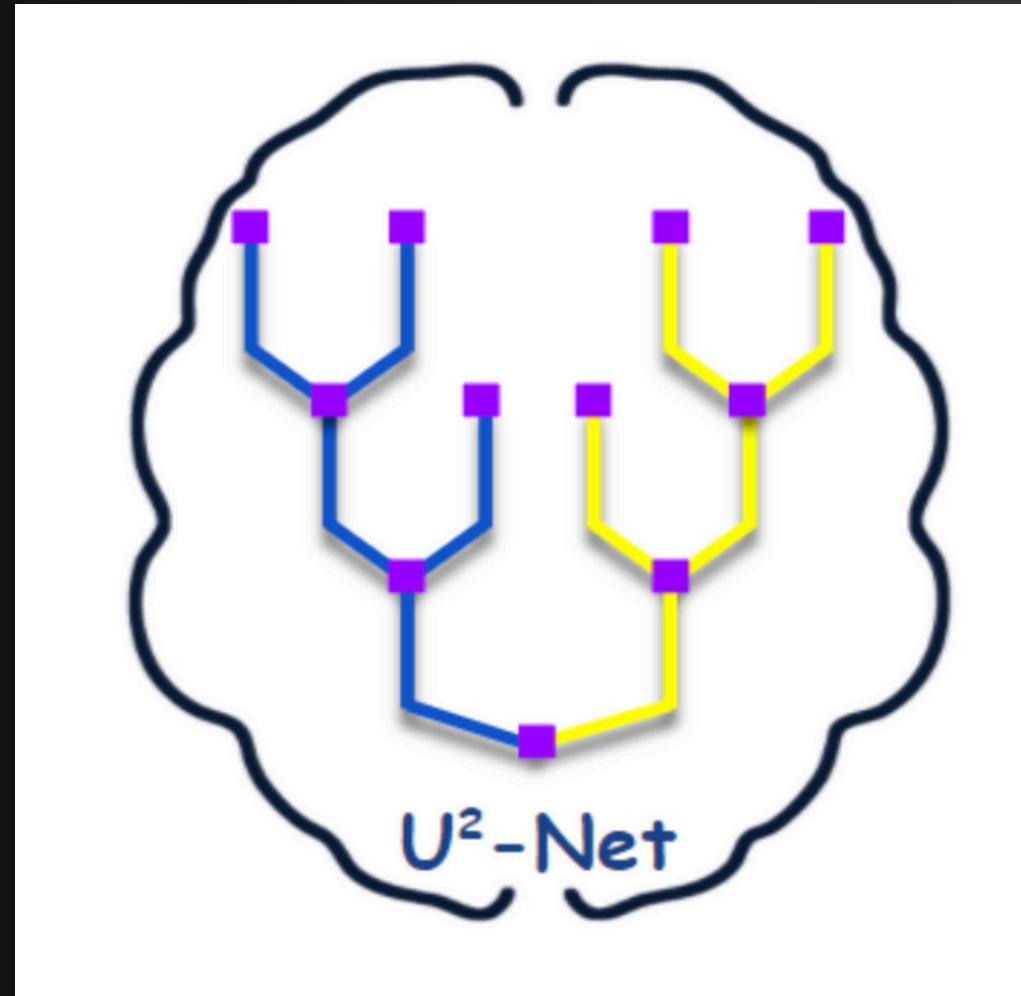


1.png



2.png

Clothing Segmentation



U2-Net: U Square Net - Nested U-Structure for Salient Object Detection
<https://github.com/xuebinqin/U-2-Net>

Image Processing

- Rescaling
- Convert to brightness value
- Save

```
def resize_image(image_path, target_size):  
    image = Image.open(image_path)  
    image = image.convert("L")  
    threshold = 200  
    # Reversing the brightness scale  
    image = image.point(lambda p: 255 - p if p < threshold else 0)  
    image = image.resize(target_size)  
    return image  
  
def save_image(image, output_path):  
    image.save(output_path)  
  
def resize_images_in_directory(input_dir, output_dir, target_size):  
    if not os.path.exists(output_dir):  
        os.makedirs(output_dir)  
  
    for filename in os.listdir(input_dir):  
        if filename.endswith('.png', '.jpg', '.jpeg'):   
            input_image_path = os.path.join(input_dir, filename)  
            output_image_path = os.path.join(output_dir, filename)  
            resized_image = resize_image(input_image_path, target_size)  
            save_image(resized_image, output_image_path)  
            print(f'Resized and saved {input_image_path} to {output_image_path}')  
  
def main():  
    input_dir = "output/alpha"  
    output_dir = "rescaled_images"  
    target_size = (28, 28)  
    resize_images_in_directory(input_dir, output_dir, target_size)  
    print("All images resized and saved successfully!")  
  
if __name__ == "__main__":  
    main()  
  
Resized and saved output/alpha/2.png to rescaled_images/2.png  
Resized and saved output/alpha/1.png to rescaled_images/1.png  
All images resized and saved successfully!
```

Prediction

- Flatten to 1D array
- Save to CSV
- Load pixel data
- Convert to correct format
- Make prediction
- Repeat for each row in CSV file

```
class_names = {
    0: "T-shirt/top",
    1: "Trouser",
    2: "Pullover",
    3: "Dress",
    4: "Coat",
    5: "Sandal",
    6: "Shirt",
    7: "Sneaker",
    8: "Bag",
    9: "Ankle boot"
}

input_directory = "rescaled_images"
csv_path = "output_image_scikit.csv"
image_files = [f for f in os.listdir(input_directory) if f.endswith('.png', '.jpg', '.jpeg')]
pixels = []

for idx, image in enumerate(image_files, start=1):
    image_path = os.path.join(input_directory, image)
    img_gray = io.imread(image_path, as_gray=True)
    pixel_array = img_gray.flatten()
    # pixel_array = 255 - pixel_array
    pixels.append(np.concatenate(([image], pixel_array)))
    print(f"Converted image {idx}: {image}")

np.savetxt(csv_path, pixels, delimiter=',', fmt='%s')
print(f"CSV file saved at: {csv_path}")

test = pd.read_csv('output_image_scikit.csv', header=None, usecols=range(1, 785))
test = test.values
test = test.reshape(-1, 28, 28, 1)

predictions = []

for idx, row in enumerate(test):
    file_name = pixels[idx][0]
    prediction = model.predict(np.array([row]))
    predicted_class = np.argmax(prediction)
    predicted_class_name = class_names[predicted_class]
    print(f"File: {file_name}, Predicted class: {predicted_class_name}")
    predictions.append(predicted_class_name)

Converted image 1: 2.png
Converted image 2: 1.png
CSV file saved at: output_image_scikit.csv
1/1 ██████████ 0s 42ms/step
File: 2.png, Predicted class: Shirt
1/1 ██████████ 0s 7ms/step
File: 1.png, Predicted class: Shirt
```

Prediction

- Make prediction and check if correct
 - **Relatively low accuracy**
- Print image
- Check if suitable

```
test = pd.read_csv('output_image_scikit.csv', header=None, usecols=range(1, 785))
test = test.values
test = test.reshape(-1, 28, 28, 1)
clothing_detected = False

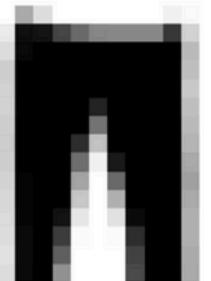
for idx, row in enumerate(test):
    file_name = pixels[idx][0]
    prediction = model.predict(np.array([row]))
    predicted_class = np.argmax(prediction)
    predicted_class_name = class_names[predicted_class]

    # Check if either trousers or dress is detected
    if 'trousers' in predicted_class_name.lower() or 'dress' in predicted_class_name.lower():
        clothing_detected = True
    if 'T-shirt/top' in predicted_class_name.lower():
        clothing_detected = False

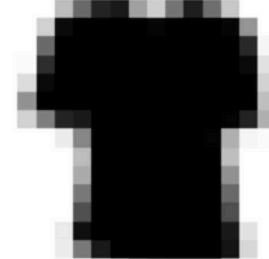
    image_data = row.reshape(28, 28)
    # Print the file name and predicted class
    print(f"File: {file_name}, Predicted class: {predicted_class_name}")

    plt.imshow(image_data, cmap='gray')
    plt.title(f"File: {file_name}, Predicted class: {predicted_class_name}")
    plt.axis('off')
    plt.show()
```

1/1 0s 7ms/step
File: 2.png, Predicted class: Shirt
File: 2.png, Predicted class: Shirt



1/1 0s 10ms/step
File: 1.png, Predicted class: Shirt
File: 1.png, Predicted class: Shirt



Prediction

```
class_names = {
    0: "T-shirt/top",
    1: "Trouser",
    2: "Pullover",
    3: "Dress",
    4: "Coat",
    5: "Sandal",
    6: "Shirt",
    7: "Sneaker",
    8: "Bag",
    9: "Ankle boot"
}

input_directory = "rescaled_images"
csv_path = "output_image_scikit.csv"
image_files = [f for f in os.listdir(input_directory) if f.endswith('.png', '.jpg', '.jpeg')]

pixels = []

for idx, image in enumerate(image_files, start=1):
    image_path = os.path.join(input_directory, image)
    img_gray = io.imread(image_path, as_gray=True)
    pixel_array = img_gray.flatten()
    # pixel_array = 255 - pixel_array
    pixels.append(np.concatenate(([image], pixel_array)))
    print(f"Converted image {idx}: {image}")

np.savetxt(csv_path, pixels, delimiter=',', fmt='%s')
print(f"CSV file saved at: {csv_path}")

test = pd.read_csv('output_image_scikit.csv', header=None, usecols=range(1, 785))
test = test.values
test = test.reshape(-1, 28, 28, 1)

predictions = []

for idx, row in enumerate(test):
    file_name = pixels[idx][0]
    prediction = model.predict(np.array([row]))
    predicted_class = np.argmax(prediction)
    predicted_class_name = class_names[predicted_class]
    print(f"File: {file_name}, Predicted class: {predicted_class_name}")
    predictions.append(predicted_class_name)

Converted image 1: 2.png
Converted image 2: 1.png
CSV file saved at: output_image_scikit.csv
1/1 0s 14ms/step
File: 2.png, Predicted class: Trouser
1/1 0s 9ms/step
File: 1.png, Predicted class: T-shirt/top
```

```
test = pd.read_csv('output_image_scikit.csv', header=None, usecols=range(1, 785))
test = test.values
test = test.reshape(-1, 28, 28, 1)
clothing_detected = False

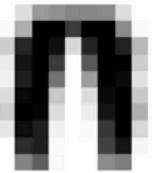
for idx, row in enumerate(test):
    file_name = pixels[idx][0]
    prediction = model.predict(np.array([row]))
    predicted_class = np.argmax(prediction)
    predicted_class_name = class_names[predicted_class]

    # Check if either trousers or dress is detected
    if 'trousers' in predicted_class_name.lower() or 'dress' in predicted_class_name.lower():
        clothing_detected = True
    if 'T-shirt/top' in predicted_class_name.lower():
        clothing_detected = False

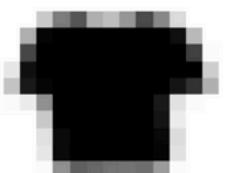
    image_data = row.reshape(28, 28)
    # Print the file name and predicted class
    print(f"File: {file_name}, Predicted class: {predicted_class_name}")

    plt.imshow(image_data, cmap='gray')
    plt.title(f"File: {file_name}, Predicted class: {predicted_class_name}")
    plt.axis('off')
    plt.show()

1/1 0s 9ms/step
File: 2.png, Predicted class: Trouser
File: 2.png, Predicted class: Trouser
```



```
1/1 0s 10ms/step
File: 1.png, Predicted class: T-shirt/top
File: 1.png, Predicted class: T-shirt/top
```



Much more accurate!

Computer Vision

- **Text to Image**
- Draw bounding boxes

```
image_path = '/Users/chae/Desktop/BigDataProj/input/Screenshot 2024-05-05 at 17.59.24.png'
img = cv2.imread(image_path)

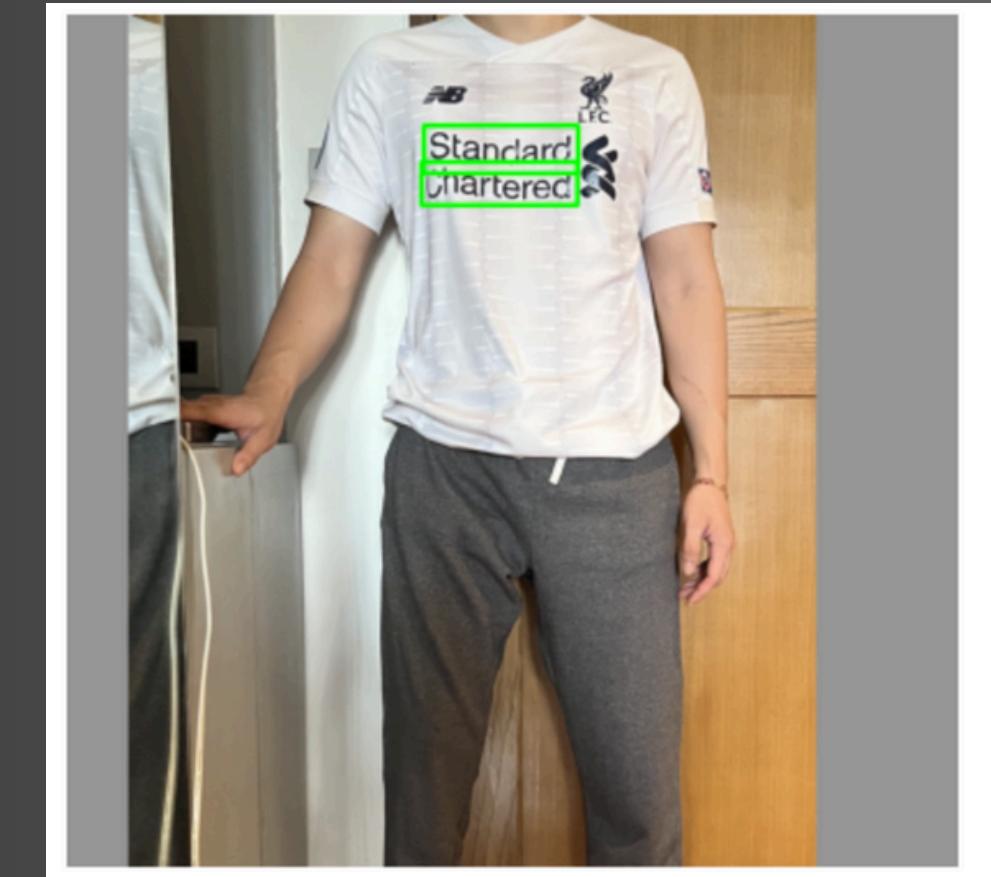
reader = easyocr.Reader(['en'], gpu=False)

text = reader.readtext(img)
store = []

for t in text:
    print(t)
    store.append(t)
    bbox, text, score = t
    pt1 = (int(bbox[0][0]), int(bbox[0][1]))
    pt2 = (int(bbox[2][0]), int(bbox[2][1]))
    cv2.rectangle(img, pt1, pt2, (0, 255, 0), 5)

plt.imshow(cv2.cvtColor(img, cv2.COLOR_BGR2RGB))
plt.axis('off')
plt.show()
```

Using CPU. Note: This module is much faster with a GPU.
([[470, 146], [673, 146], [673, 209], [470, 209]], 'Standard', 0.4882621699467346)
([[467, 194], [672, 194], [672, 251], [467, 251]], 'Chartered', 0.9371480032896289)



Final Result

```
store_words = [entry[1] for entry in store]
combined_sentence = ' '.join(store_words)
words = combined_sentence.split()

if len(words) < 5 and clothing_detected:
    if profanity.contains_profanity(combined_sentence):
        print('Inappropriate Clothing')
    else:
        print('Suitable Clothing')
else:
    print('Inappropriate Clothing')
```

Inappropriate Clothing

THANK YOU FOR LISTENING