## Nickhil Tekwani | CS 6220 | HW3B tSNE, Feature Selection, Image HAAR Features

## PROBLEM 1: tSNE dim reduction

```
In [3]: import numpy as np
import matplotlib.pyplot as plt

from sklearn.datasets import fetch_openml, fetch_20newsgroups
from sklearn.feature_extraction.text import TfidfVectorizer
from sklearn.manifold import TSNE

mnist = fetch_openml('mnist_784', version=1)
mnist_data, mnist_labels = mnist.data, mnist.target

newsgroups = fetch_20newsgroups(subset='all', remove=('headers', 'footers', vectorizer = TfidfVectorizer(max_features=2000) # Limit features for bette
newsgroups_data = vectorizer.fit_transform(newsgroups.data).todense()
newsgroups_labels = newsgroups.target
```

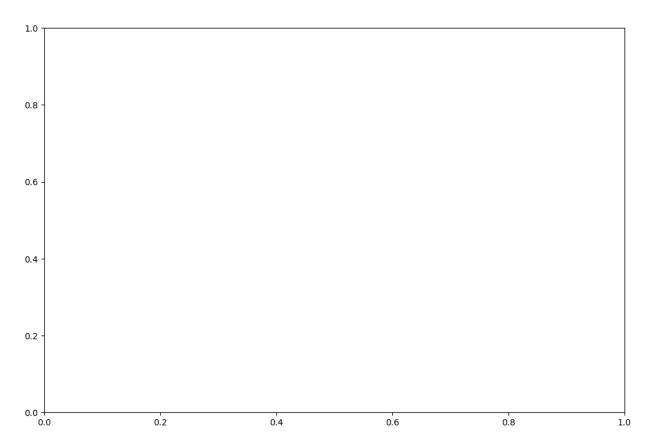
/usr/local/lib/python3.10/site-packages/sklearn/datasets/\_openml.py:968: FutureWarning: The default value of `parser` will change from `'liac-arf f'` to `'auto'` in 1.4. You can set `parser='auto'` to silence this warning. Therefore, an `ImportError` will be raised from 1.4 if the dataset is dense and pandas is not installed. Note that the pandas parser may return different data types. See the Notes Section in fetch\_openml's API doc for details.

warn(

```
ValueError
                                          Traceback (most recent call las
t)
File /usr/local/lib/python3.10/site-packages/matplotlib/axes/ axes.py:443
9, in Axes. parse scatter color args(c, edgecolors, kwargs, xsize, get ne
xt color func)
   4438 try: # Is 'c' acceptable as PathCollection facecolors?
            colors = mcolors.to rgba array(c)
   4440 except (TypeError, ValueError) as err:
File /usr/local/lib/python3.10/site-packages/matplotlib/colors.py:487, in
to rgba array(c, alpha)
    486 else:
           rgba = np.array([to_rgba(cc) for cc in c])
--> 487
    489 if alpha is not None:
File /usr/local/lib/python3.10/site-packages/matplotlib/colors.py:487, in
stcomp>(.0)
    486 else:
--> 487
           rgba = np.array([to_rgba(cc) for cc in c])
    489 if alpha is not None:
File /usr/local/lib/python3.10/site-packages/matplotlib/colors.py:299, in
to rgba(c, alpha)
    298 if rgba is None: # Suppress exception chaining of cache lookup f
ailure.
--> 299
           rgba = to rgba no colorcycle(c, alpha)
    300
           try:
File /usr/local/lib/python3.10/site-packages/matplotlib/colors.py:370, in
to rgba no colorcycle(c, alpha)
    369 if not (0 \le c \le 1):
--> 370 raise ValueError(
                f"Invalid string grayscale value {orig c!r}. "
    371
    372
                f"Value must be within 0-1 range")
    373 return c, c, c, alpha if alpha is not None else 1.
ValueError: Invalid string grayscale value '5'. Value must be within 0-1
range
The above exception was the direct cause of the following exception:
ValueError
                                          Traceback (most recent call las
t)
Cell In [6], line 15
     13 # Run t-SNE for MNIST and 20NG:
     14 perplexities = [5, 20, 100]
---> 15 run_tsne_and_plot(mnist_data, mnist_labels, perplexities, dataset
_name='MNIST')
     16 run tsne and plot(newsgroups data, newsgroups labels, perplexitie
s, dataset name='20 Newsgroups')
Cell In [6], line 8, in run tsne and plot(data, labels, perplexities, n c
omponents, dataset name)
      5 reduced data = tsne.fit transform(data)
      7 plt.figure(figsize=(12, 8))
```

```
----> 8 scatter = plt.scatter(reduced data[:, 0], reduced data[:, 1], c=1
abels, cmap='viridis', alpha=0.6)
      9 plt.colorbar(scatter, boundaries=np.arange(len(np.unique(labels))
+1)-0.5).set ticks(np.arange(len(np.unique(labels))))
     10 plt.title(f'{dataset_name} t-SNE with perplexity {perplexity}')
File /usr/local/lib/python3.10/site-packages/matplotlib/pyplot.py:2862, i
n scatter(x, y, s, c, marker, cmap, norm, vmin, vmax, alpha, linewidths,
edgecolors, plotnonfinite, data, **kwargs)
   2857 @ copy docstring and deprecators(Axes.scatter)
   2858 def scatter(
   2859
                x, y, s=None, c=None, marker=None, cmap=None, norm=None,
                vmin=None, vmax=None, alpha=None, linewidths=None, *,
   2860
   2861
                edgecolors=None, plotnonfinite=False, data=None, **kwarg
s):
            __ret = gca().scatter(
-> 2862
   2863
                x, y, s=s, c=c, marker=marker, cmap=cmap, norm=norm,
   2864
                vmin=vmin, vmax=vmax, alpha=alpha, linewidths=linewidths,
   2865
                edgecolors=edgecolors, plotnonfinite=plotnonfinite,
   2866
                **({"data": data} if data is not None else {}), **kwargs)
   2867
            sci(__ret)
            return ret
   2868
File /usr/local/lib/python3.10/site-packages/matplotlib/__init__.py:1442,
in preprocess data.<locals>.inner(ax, data, *args, **kwargs)
   1439 @functools.wraps(func)
   1440 def inner(ax, *args, data=None, **kwargs):
   1441
            if data is None:
-> 1442
                return func(ax, *map(sanitize sequence, args), **kwargs)
            bound = new sig.bind(ax, *args, **kwargs)
   1444
   1445
            auto label = (bound.arguments.get(label namer)
   1446
                          or bound.kwargs.get(label namer))
File /usr/local/lib/python3.10/site-packages/matplotlib/axes/ axes.py:460
2, in Axes.scatter(self, x, y, s, c, marker, cmap, norm, vmin, vmax, alph
a, linewidths, edgecolors, plotnonfinite, **kwargs)
   4599 if edgecolors is None:
   4600
            orig edgecolor = kwargs.get('edgecolor', None)
   4601 c, colors, edgecolors = \
-> 4602
            self. parse scatter color args(
   4603
                c, edgecolors, kwargs, x.size,
   4604
                get next color func=self. get patches for fill.get next c
olor)
   4606 if plotnonfinite and colors is None:
   4607
            c = np.ma.masked invalid(c)
File /usr/local/lib/python3.10/site-packages/matplotlib/axes/ axes.py:444
8, in Axes. parse scatter color args(c, edgecolors, kwargs, xsize, get ne
xt color func)
   4445
                    raise invalid shape exception(c.size, xsize) from err
               # Both the mapping *and* the RGBA conversion failed: pret
   4446
ty
   4447
               # severe failure => one may appreciate a verbose feedbac
k.
-> 4448
                raise ValueError(
   4449
                    f"'c' argument must be a color, a sequence of colors,
```

```
f"or a sequence of numbers, not {c!r}") from err
   4450
   4451 else:
   4452
            if len(colors) not in (0, 1, xsize):
                # NB: remember that a single color is also acceptable.
   4453
   4454
                # Besides *colors* will be an empty array if c == 'none'.
ValueError: 'c' argument must be a color, a sequence of colors, or a sequ
ence of numbers, not 0
1
         0
         4
2
3
         1
4
         9
69995
         2
69996
         3
69997
         4
69998
         5
69999
Name: class, Length: 70000, dtype: category
Categories (10, object): ['0', '1', '2', '3', ..., '6', '7', '8', '9']
```



```
In []: # visualize in 3d
from mpl_toolkits.mplot3d import Axes3D

def run_tsne_and_plot_3d(data, labels, perplexities, dataset_name=''):
    for perplexity in perplexities:
        tsne = TSNE(n_components=3, perplexity=perplexity)
        reduced_data = tsne.fit_transform(data)

fig = plt.figure(figsize=(12, 8))
    ax = fig.add_subplot(111, projection='3d')
    scatter = ax.scatter(reduced_data[:, 0], reduced_data[:, 1], reduce
    plt.colorbar(scatter, boundaries=np.arange(len(np.unique(labels))+1
        plt.title(f'{dataset_name} t-SNE 3D with perplexity {perplexity}')
        plt.show()

# For 3D visualization:
    run_tsne_and_plot_3d(mnist_data, mnist_labels, perplexities, dataset_name='
    run_tsne_and_plot_3d(newsgroups_data, newsgroups_labels, perplexities, data
```