

```
In [35]: DATA_DIR = '/data/tmp/arogya/afg_updated/'
PREDICTIONS_DIR = f'{DATA_DIR}/outputs/predictions'
POPPY_COUNTS_FILE = '../../../data/inputs/poppy_1994-2020.csv'
```

```
In [104]: import os
import pandas as pd
import numpy as np
pred_dirs = os.listdir(PREDICTIONS_DIR)
```

```
In [48]: def get_poppy_pixels(filepath, year, district):
counts = pd.read_csv(filepath)
# return counts
return counts[counts['distid']==district][f'X{year}'].iloc[0]
```

```
In [49]: get_poppy_pixels(POPPY_COUNTS_FILE, '2019', 2305)
```

```
Out[49]: 1857.0
```

```
In [54]: all_results = None
for run in pred_dirs:
    results = f'{PREDICTIONS_DIR}/{run}/{run}.csv'
    results = pd.read_csv(results)
    results['model'] = run.split("_")[0]
    results['n'] = run.split("_")[1]
    results['dataset'] = run.split("_")[2] + "_" + dir.split("_")[3]
    results['district'] = run.split("_")[4]
    results['unodc_ha'] = get_poppy_pixels(POPPY_COUNTS_FILE, '2019', int(run.split("_")))
    if all_results is None:
        all_results = results
    else:
        all_results = pd.concat([all_results, results], axis=0)

# print(dir)
```

```
In [96]: datasets = ["diff_bands", "pre_bands"]
models = ["kmeans", "gmm"]
ns = [3,4,5]

corrs = None
for model in models:
    for dataset in datasets:
        for n in ns:
            df = all_results[all_results['model']==model]
            df = df[df['n']==str(n)]
            df = df[df['dataset']==dataset]
            df = df[['clust', 'clustering_ha', 'unodc_ha']].groupby('clust').corr()
            df = df.reset_index()
            df = df[df['level_1'] != 'unodc_ha']
            df = df.drop(['level_1', 'clustering_ha'], axis=1)
            df.columns = ['clust', 'pearson_correlation']
            df['model'] = model
            df['n'] = n
            df['dataset'] = dataset

            if df is None:
                corrs = df
            else:
                corrs = pd.concat([df, corrs], axis=0)
```

```
In [99]: corrs.sort_values('pearson_correlation', ascending=False)
```

Out[99]:

| | clust | pearson_correlation | model | n | dataset | |
|---|-------|---------------------|----------|-----|------------|------------|
| | 4 | 2.0 | 0.938810 | gmm | 3 | diff_bands |
| 0 | 0.0 | 0.932809 | kmeans | 5 | diff_bands | |
| 2 | 1.0 | 0.928945 | gmm | 5 | diff_bands | |
| 0 | 0.0 | 0.927670 | gmm | 4 | pre_bands | |
| 2 | 1.0 | 0.927276 | kmeans | 4 | pre_bands | |
| 2 | 1.0 | 0.921378 | kmeans | 5 | pre_bands | |
| 4 | 2.0 | 0.920846 | gmm | 5 | pre_bands | |
| 0 | 0.0 | 0.916571 | kmeans | 3 | pre_bands | |
| 2 | 1.0 | 0.916365 | kmeans | 4 | diff_bands | |
| 0 | 0.0 | 0.915271 | gmm | 5 | pre_bands | |
| 0 | 0.0 | 0.914517 | kmeans | 3 | diff_bands | |
| 4 | 2.0 | 0.898531 | gmm | 3 | pre_bands | |
| 4 | 2.0 | 0.894333 | gmm | 4 | pre_bands | |
| 6 | 3.0 | 0.887577 | gmm | 4 | diff_bands | |
| 8 | 4.0 | 0.881561 | kmeans | 5 | diff_bands | |
| 8 | 4.0 | 0.869490 | gmm | 5 | pre_bands | |
| 6 | 3.0 | 0.867396 | kmeans | 5 | pre_bands | |
| 0 | 0.0 | 0.866659 | gmm | 3 | pre_bands | |
| 4 | 2.0 | 0.866255 | kmeans | 4 | diff_bands | |
| 2 | 1.0 | 0.837989 | gmm | 3 | diff_bands | |
| 0 | 0.0 | 0.831256 | gmm | 5 | diff_bands | |
| 0 | 0.0 | 0.830782 | gmm | 4 | diff_bands | |
| 6 | 3.0 | 0.822872 | gmm | 5 | diff_bands | |
| 6 | 3.0 | 0.800723 | kmeans | 4 | pre_bands | |
| 8 | 4.0 | 0.792191 | kmeans | 5 | pre_bands | |
| 6 | 3.0 | 0.778957 | gmm | 5 | pre_bands | |
| 2 | 1.0 | 0.771889 | kmeans | 3 | diff_bands | |
| 0 | 0.0 | 0.768832 | kmeans | 4 | pre_bands | |
| 6 | 3.0 | 0.764168 | kmeans | 5 | diff_bands | |
| 6 | 3.0 | 0.750607 | gmm | 4 | pre_bands | |
| 0 | 0.0 | 0.742178 | kmeans | 4 | diff_bands | |
| 0 | 0.0 | 0.722096 | kmeans | 5 | pre_bands | |
| 4 | 2.0 | 0.720932 | kmeans | 3 | pre_bands | |
| 2 | 1.0 | 0.718002 | kmeans | 3 | pre_bands | |
| 4 | 2.0 | 0.700438 | kmeans | 5 | diff_bands | |
| 4 | 2.0 | 0.696918 | kmeans | 3 | diff_bands | |
| 6 | 3.0 | 0.662073 | kmeans | 4 | diff_bands | |
| 2 | 1.0 | 0.650113 | kmeans | 5 | diff_bands | |
| 2 | 1.0 | 0.561643 | gmm | 3 | pre_bands | |
| | | | | | | |

| | | | | | |
|---|-----|-----------|--------|---|------------|
| 4 | 2.0 | 0.550680 | gmm | 4 | diff_bands |
| 0 | 0.0 | 0.519208 | gmm | 3 | diff_bands |
| 2 | 1.0 | 0.496216 | gmm | 4 | pre_bands |
| 4 | 2.0 | 0.493390 | kmeans | 4 | pre_bands |
| 4 | 2.0 | 0.478239 | kmeans | 5 | pre_bands |
| 4 | 2.0 | 0.434769 | gmm | 5 | diff_bands |
| 2 | 1.0 | 0.207858 | gmm | 5 | pre_bands |
| 2 | 1.0 | -0.023217 | gmm | 4 | diff_bands |
| 8 | 4.0 | -0.023958 | gmm | 5 | diff_bands |

```
In [105.. total_prod = all_results.groupby(['district']).max('unodc_ha').sum()['unodc_ha']
dist_index = all_results.groupby('district').apply(lambda x: np.max(x['unodc_ha'])/total
```

```
In [106.. total_prod
```

```
Out[106]: 80587.0
```

```
In [115.. indices = pd.DataFrame(dist_index)
indices.columns = ['yield_index']
```

```
In [120.. all_results = pd.merge(all_results, indices, on='district')
```

```
In [136.. all_results['yield_corrected_se'] = (((all_results['clustering_ha'] - all_results['unodc
```

```
In [137.. all_results.groupby(['model', 'n', 'dataset', 'clust']).sum()['yield_corrected_se'].rese
```

```
Out[137]:
```

| | model | n | dataset | clust | yield_corrected_se |
|----|--------|---|------------|-------|--------------------|
| 15 | gmm | 5 | diff_bands | 1.0 | 5.759050e+06 |
| 38 | kmeans | 5 | diff_bands | 0.0 | 6.002431e+06 |
| 34 | kmeans | 4 | pre_bands | 0.0 | 7.680648e+06 |
| 44 | kmeans | 5 | pre_bands | 1.0 | 7.778827e+06 |
| 35 | kmeans | 4 | pre_bands | 1.0 | 7.905353e+06 |
| 10 | gmm | 4 | pre_bands | 0.0 | 9.180176e+06 |
| 31 | kmeans | 4 | diff_bands | 1.0 | 9.246428e+06 |
| 23 | gmm | 5 | pre_bands | 4.0 | 9.856746e+06 |
| 46 | kmeans | 5 | pre_bands | 3.0 | 1.222376e+07 |
| 19 | gmm | 5 | pre_bands | 0.0 | 1.318496e+07 |
| 25 | kmeans | 3 | diff_bands | 1.0 | 1.324935e+07 |
| 12 | gmm | 4 | pre_bands | 2.0 | 1.367780e+07 |
| 43 | kmeans | 5 | pre_bands | 0.0 | 1.591301e+07 |
| 24 | kmeans | 3 | diff_bands | 0.0 | 1.637102e+07 |
| 5 | gmm | 3 | pre_bands | 2.0 | 1.647622e+07 |
| 21 | gmm | 5 | pre_bands | 2.0 | 1.687615e+07 |
| 40 | kmeans | 5 | diff_bands | 2.0 | 1.811781e+07 |
| 30 | kmeans | 4 | diff_bands | 0.0 | 2.072288e+07 |

| | | | | | |
|----|--------|---|------------|-----|--------------|
| 41 | kmeans | 5 | diff_bands | 3.0 | 2.110958e+07 |
| 28 | kmeans | 3 | pre_bands | 1.0 | 2.409270e+07 |
| 1 | gmm | 3 | diff_bands | 1.0 | 2.512654e+07 |
| 33 | kmeans | 4 | diff_bands | 3.0 | 2.593608e+07 |
| 32 | kmeans | 4 | diff_bands | 2.0 | 2.661342e+07 |
| 29 | kmeans | 3 | pre_bands | 2.0 | 2.666057e+07 |
| 39 | kmeans | 5 | diff_bands | 1.0 | 2.669079e+07 |
| 11 | gmm | 4 | pre_bands | 1.0 | 2.709750e+07 |
| 37 | kmeans | 4 | pre_bands | 3.0 | 2.805791e+07 |
| 47 | kmeans | 5 | pre_bands | 4.0 | 2.840935e+07 |
| 13 | gmm | 4 | pre_bands | 3.0 | 2.845762e+07 |
| 36 | kmeans | 4 | pre_bands | 2.0 | 2.915300e+07 |
| 45 | kmeans | 5 | pre_bands | 2.0 | 3.202392e+07 |
| 27 | kmeans | 3 | pre_bands | 0.0 | 3.241239e+07 |
| 42 | kmeans | 5 | diff_bands | 4.0 | 3.340544e+07 |
| 2 | gmm | 3 | diff_bands | 2.0 | 3.346943e+07 |
| 4 | gmm | 3 | pre_bands | 1.0 | 3.399401e+07 |
| 17 | gmm | 5 | diff_bands | 3.0 | 3.587112e+07 |
| 3 | gmm | 3 | pre_bands | 0.0 | 3.769231e+07 |
| 22 | gmm | 5 | pre_bands | 3.0 | 3.975068e+07 |
| 20 | gmm | 5 | pre_bands | 1.0 | 4.554954e+07 |
| 9 | gmm | 4 | diff_bands | 3.0 | 4.756753e+07 |
| 8 | gmm | 4 | diff_bands | 2.0 | 5.338955e+07 |
| 16 | gmm | 5 | diff_bands | 2.0 | 6.466623e+07 |
| 18 | gmm | 5 | diff_bands | 4.0 | 8.831185e+07 |
| 7 | gmm | 4 | diff_bands | 1.0 | 8.871236e+07 |
| 0 | gmm | 3 | diff_bands | 0.0 | 9.225264e+07 |
| 6 | gmm | 4 | diff_bands | 0.0 | 9.421877e+07 |
| 14 | gmm | 5 | diff_bands | 0.0 | 9.427790e+07 |
| 26 | kmeans | 3 | diff_bands | 2.0 | 1.012442e+08 |

In [139]...

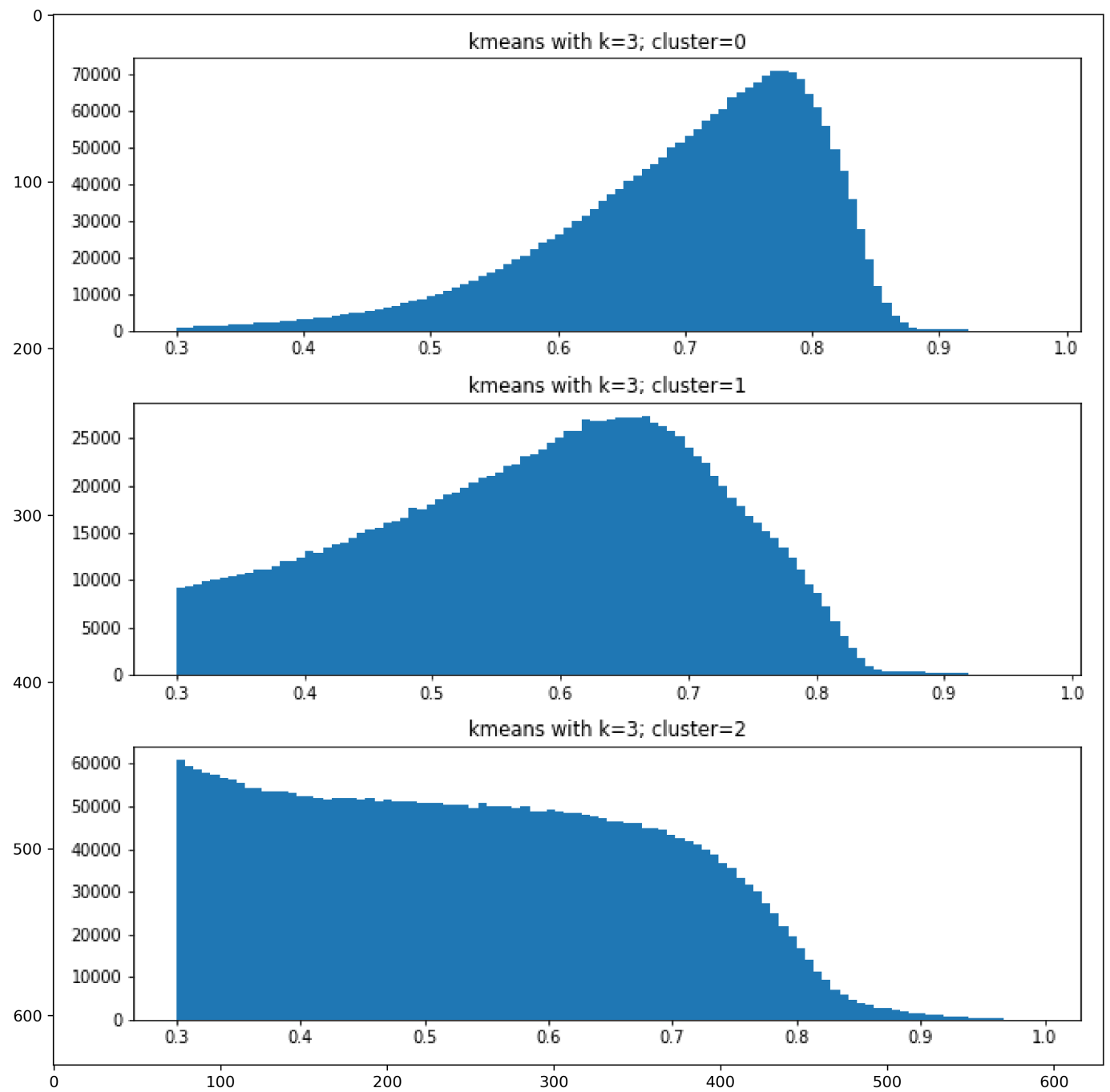
```
import matplotlib.pyplot as plt
import matplotlib.image as mpimg

# nrows = len(districts['full'])//3
fig, ax = plt.subplots(1,1,dpi=300, figsize=(10,10))
# ax = ax.flatten()

ax.imshow(mpimg.imread(f"{PREDICTIONS_DIR}/kmeans_3_diff_bands_2308/kmeans_3_diff_bands_2308.png"))

# for i, dist in enumerate(districts['full']):
#     ax[i].imshow(mpimg.imread(f"{PREDICTIONS_DIR}/ndvi_{dist}_gmm_5.png"))
#     ax[i].set_title(dist)
#     ax[i].set_xticks([])
```

```
# ax[i].set_yticks([])  
plt.tight_layout()
```



In []: