

```
import numpy as np
import matplotlib
import matplotlib.pyplot as plt
import pandas as pd
```

```
url_votes = 'https://raw.githubusercontent.com/exemplary-citizen/PCA-and-Senate-Voting-Dat
senator_df = pd.read_csv(url_votes + 'data_matrix.csv', error_bad_lines=False)
af = pd.read_csv(url_votes + 'politician_labels.txt', header=None)
af["affiliations"] = af[0].str.split().str[-1]
```

```
X = np.array(senator_df.values[:, 3:].T, dtype='float64')
```

```
affiliations = af["affiliations"]
print(affiliations)
aff_list = list(affiliations)
```

```
0      Red
1      Blue
2      Blue
3      Blue
4      Blue
...
95     Blue
96     Blue
97      Red
98      Red
99      Red
Name: affiliations, Length: 100, dtype: object
```

```
from sklearn import preprocessing
le = preprocessing.LabelEncoder()
le.fit(affiliations)
print(le.classes_)
cat = le.transform(affiliations)
```

```
['Blue' 'Red' 'Yellow']
```

```
from sklearn.cluster import KMeans
kmeans = KMeans(n_clusters=2).fit(X)
labels = kmeans.predict(X)
```

```
errors = []
for i in range(0,100):
    if cat[i]!=labels[i]:
        errors.append(i)
print(errors)
```

```
[21, 34, 58, 62]
```

Senators that were misclassified

```
error_list = []
```

```
for i in errors:
    error_list.append(af[0][i])
print(error_list)
```

```
['Nelson Blue', 'Jeffords Yellow', 'Chafee Red', 'Dayton Yellow']
```

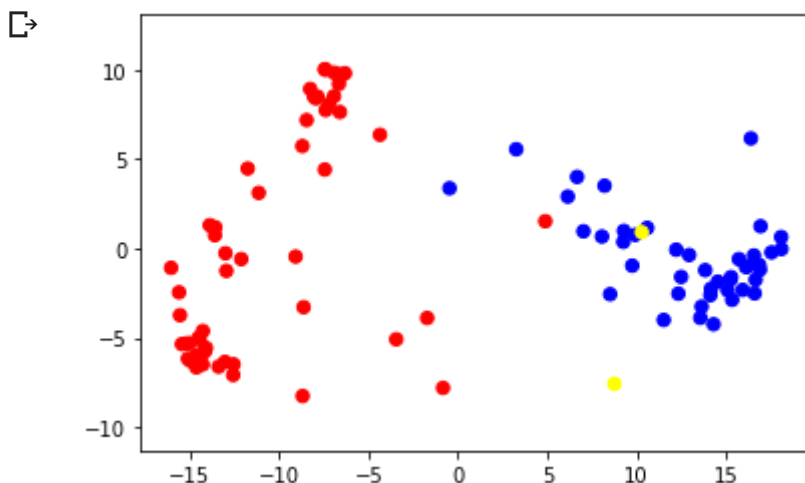
These senators were misclassified because kmeans forms circular clusters and the data point this circular cluster boundary. That is K means is quite sensitive to outliers.

The results can be visualized by plotting data in a space of reduced dimensions

```
X_mean = np.mean(X, axis = 0)
X_original = X.copy()
X = X - np.mean(X, axis = 0)

from sklearn.decomposition import PCA
pca = PCA(n_components=2)
projected = pca.fit_transform(X)

from sklearn.cluster import KMeans
kmeans = KMeans(2)
labels = kmeans.fit(projected).predict(projected)
plt.scatter(projected[:, 0], projected[:, 1], c=affiliations, s=40, cmap='viridis');
ax = plt.gca()
ax.axis('equal')
plt.show();
```



Misclassified senators

```
repub = np.where(affiliations=='Red')
repub = np.squeeze(repub)
sen_id = np.where(projected[repub,0] >= 0)
print(af[0][repub[sen_id]])
```

```
repub = np.where(affiliations=='Blue')
repub = np.squeeze(repub)
sen_id = np.where(projected[repub,0] <= 0)
```

```
sen_id = np.where(projected[repub,0] != 0,
print(af[0][repub[sen_id]])
```

```
repub = np.where(affiliations=='Yellow')
repub = np.squeeze(repub)
print(af[0][repub])
```

```
↳ 58    Chafee Red
    Name: 0, dtype: object
    21    Nelson Blue
    Name: 0, dtype: object
    34    Jeffords Yellow
    62    Dayton Yellow
    Name: 0, dtype: object
```

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