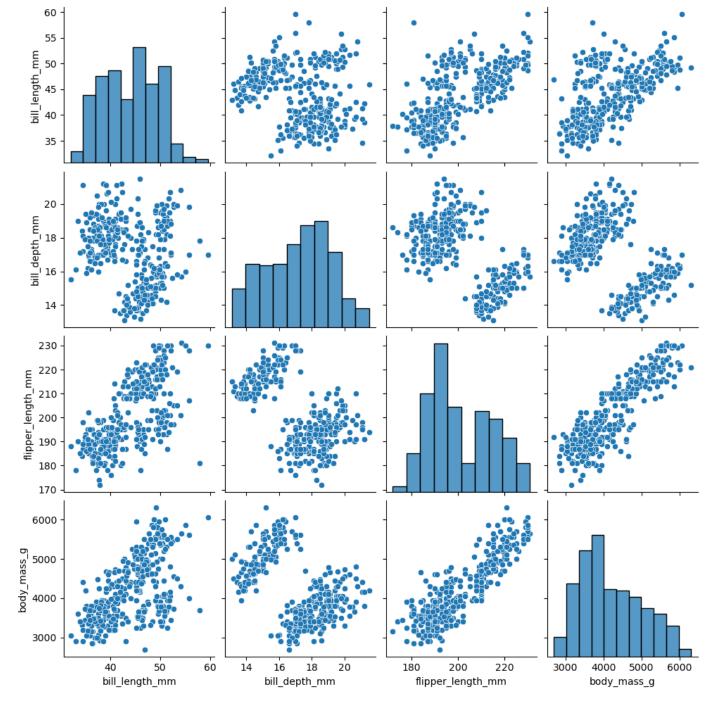
## **Multivariate Analysis**

## Clustering

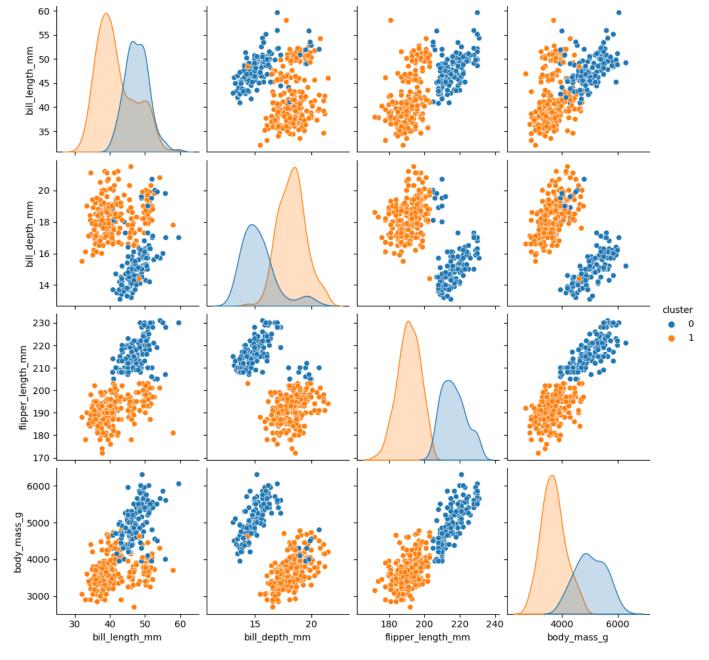
```
In [345...
           import pandas as pd
           import seaborn as sns
           from sklearn.cluster import KMeans
           import matplotlib.pyplot as plt
           from sklearn import metrics
In [346...
           from sklearn.metrics import pairwise distances
In [347... penguins = sns.load_dataset("penguins")
           penguins = penguins.dropna()
          penguins.head()
                        island bill_length_mm bill_depth_mm flipper_length_mm body_mass_g
Out[347]:
              species
                                                                                             sex
           0 Adelie Torgersen
                                         39.1
                                                       18.7
                                                                       181.0
                                                                                   3750.0
                                                                                            Male
              Adelie Torgersen
                                         39.5
                                                      17.4
                                                                       186.0
                                                                                   3800.0 Female
                                        40.3
                                                                                   3250.0 Female
              Adelie Torgersen
                                                       18.0
                                                                       195.0
              Adelie Torgersen
                                                      19.3
                                                                       193.0
                                                                                   3450.0 Female
                                         36.7
              Adelie Torgersen
                                         39.3
                                                      20.6
                                                                       190.0
                                                                                   3650.0
                                                                                            Male
          sns.pairplot(penguins)
In [348...
```

plt.show()



Kijkend naar dit overzicht lijken er 2 duidelijke clusters te zijn voor body mass en flipper length. Verder lijkt het ook dat er 3 clusters zijn tussen bijvoorbeeld body mass en bill length en flipper length en bill length.

```
In [349... features = ['flipper_length_mm']
    km = KMeans(n_clusters=2, random_state=43).fit(penguins[features])
In [350... penguins['cluster'] = km.predict(penguins[features])
In [351... sns.pairplot(penguins, hue="cluster")
    plt.show()
```

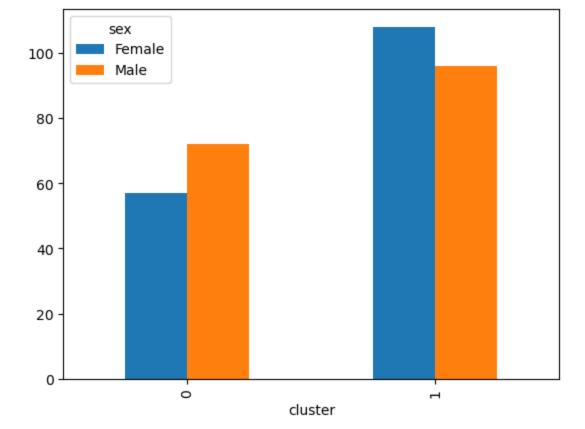


In [352... metrics.silhouette\_score(penguins[features], km.labels\_, metric='euclidean') 0.6892852079650291

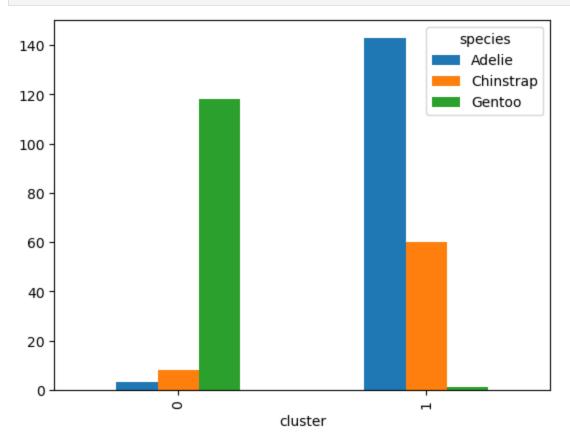
Out[352]:

Na wat uitproberen blijkt dat twee clusters zoeken met flipper length de beste silhouette score geeft.

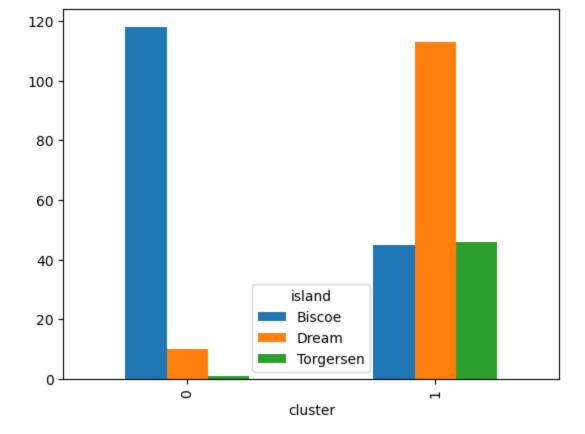
```
contingency_table = penguins.groupby(['sex','cluster']).size().unstack('sex', fill_value
In [353...
         contingency table.plot(kind='bar')
         plt.show()
```



In [354...
contingency\_table = penguins.groupby(['species','cluster']).size().unstack('species', fi
contingency\_table.plot(kind='bar')
plt.show()

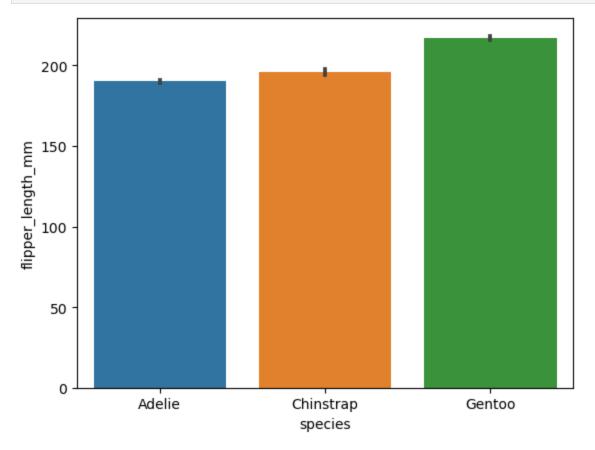


In [355... contingency\_table = penguins.groupby(['island','cluster']).size().unstack('island', fill contingency\_table.plot(kind='bar')
 plt.show()

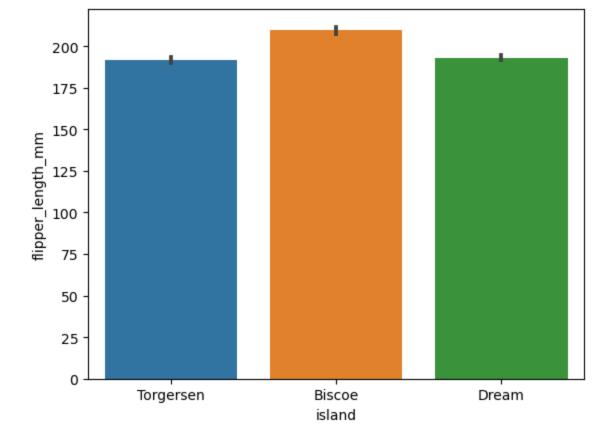


Van deze clusters zien we een scheiding tussen de species Gentoo en de andere species. Het verschil in flipper length tussen Adelie en Chinstrap net zoals Dream en Torgersen is dus blijkbaar niet zo groot.

```
In [356... sns.barplot(y="flipper_length_mm", x='species', data=penguins)
plt.show()
```



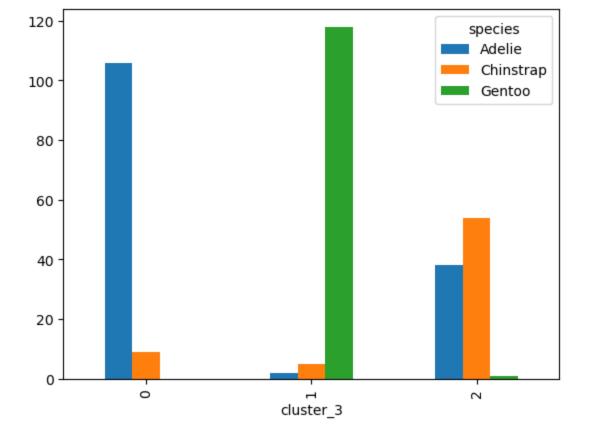
```
In [357... sns.barplot(y="flipper_length_mm", x='island', data=penguins)
plt.show()
```



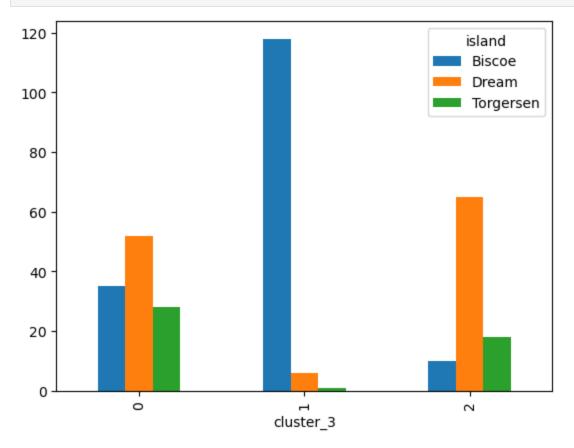
Het is het wel waard om nog te kijken of er een combinatie is van features die ofwel island ofwel species beter kan voorspellen met drie clusters.

```
In [358... features_3 = ['flipper_length_mm', 'bill_length_mm']
   km_3 = KMeans(n_clusters=3, random_state=43).fit(penguins[features_3])
In [359... penguins['cluster_3'] = km_3.predict(penguins[features_3])
In [360... metrics.silhouette_score(penguins[features_3], km_3.labels_, metric='euclidean')
Out[360]: 0.48062618684371117
```

Je krijg met alleen massa de hoogste silhouette score. Als je echter gaat kijken naar hoe het over species en eilanden is verdeeld, zie je dat een combinatie van flipper lenght en bill length zorgt dat Adelie beter gescheiden is van Chinstrap.



In [362...
contingency\_table = penguins.groupby(['cluster\_3','island']).size().unstack('island', fi
contingency\_table.plot(kind='bar')
plt.show()



In [366... sns.pairplot(penguins.drop(['cluster'], axis=1), hue="species")
plt.show()

