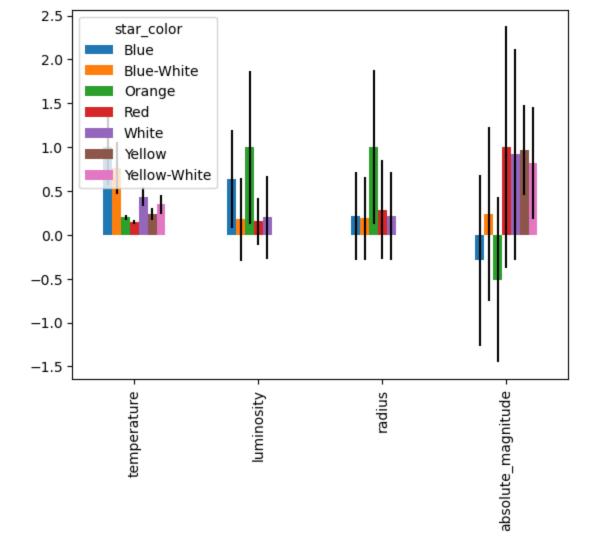
Multivariate Analysis

Classification

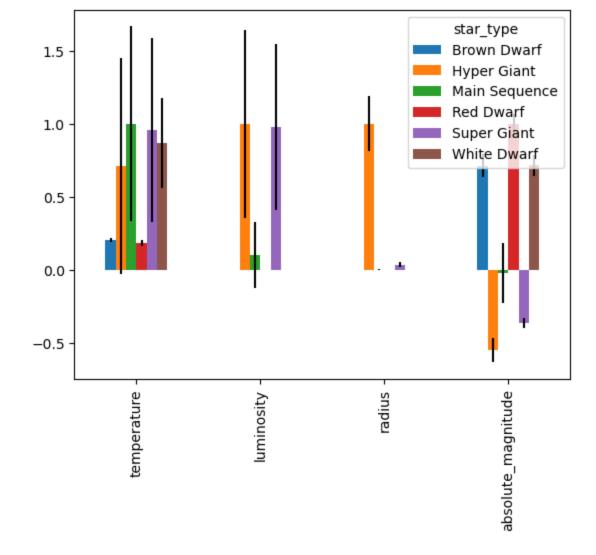
```
import pandas as pd
In [42]:
         import numpy as np
         data = pd.read csv('star dataset.csv')
In [43]:
         data.rename(columns={'Temperature (K)': 'temperature', 'Luminosity(L/Lo)' :'luminosity',
         data.head()
            temperature luminosity radius absolute_magnitude
                                                           star_type star_color spectral_class
Out[43]:
         0
                  3068
                         0.002400 0.1700
                                                     16.12
                                                          Red Dwarf
                                                                         Red
                                                                                       Μ
                  3042
                         0.000500 0.1542
                                                     16.60 Red Dwarf
                                                                         Red
                                                                                       Μ
         2
                  2600
                         0.000300 0.1020
                                                     18.70 Red Dwarf
                                                                         Red
                                                                                       Μ
                                                     16.65 Red Dwarf
                  2800
                         0.000200 0.1600
         3
                                                                         Red
                                                                                       Μ
         4
                  1939
                         0.000138 0.1030
                                                     20.06 Red Dwarf
                                                                                       Μ
                                                                         Red
         grouped = data.groupby('star color')
In [44]:
         normalized = (grouped.mean() / grouped.mean().max()).transpose()
         errors = (grouped.std() / grouped.mean().max()).transpose()
         normalized.plot(kind='bar', yerr=errors)
```

Out[44]: <AxesSubplot:>



Het lijkt hier dat star color alleen goed kan worden bepaald door de temperatuur, dus is dit geen handige categorie om te kiezen voor de multivariable analysis. Spectral type had een leuke categorie geweest om te voorspellen, echter spectral type is gerelateerd aan de kleur en er is maar één waarde voor G, waardoor de analyse niet kan worden uitgevoerd tenzij deze waarde eruit wordt gehaald.

```
In [45]: grouped = data.groupby('star_type')
    normalized = (grouped.mean() / grouped.mean().max()).transpose()
    errors = (grouped.std() / grouped.mean().max()).transpose()
    normalized.plot(kind='bar', yerr=errors)
Out[45]:
```



Star type heeft wel significante verschillen bij de radius (zoals ook te zien in assignment 12) en de absolute magnitude.

```
In [46]:
         from sklearn.model selection import train test split
In [47]:
         star type = 'star type'
         data train st, data test st = train test split(data, test size=0.3, random state=42, str
         from sklearn.tree import DecisionTreeClassifier
In [48]:
         properties st = ['radius', 'absolute magnitude']
In [49]:
         dt classification st = DecisionTreeClassifier(max depth = 10)
         dt classification st.fit(data train st[properties st], data train st[star type])
         DecisionTreeClassifier(max depth=10)
Out[49]:
         def calculate_accuracy(predictions, actuals):
In [50]:
             if(len(predictions) != len(actuals)):
                 raise Exception ("The amount of predictions did not equal the amount of actuals")
             return (predictions == actuals).sum() / len(actuals)
        predictionsOnTrainset st = dt classification st.predict(data train st[properties st])
In [51]:
         predictionsOnTestset st = dt classification st.predict(data test st[properties st])
         accuracyTrain st = calculate accuracy(predictionsOnTrainset st, data train st.star type)
         accuracyTest st = calculate accuracy(predictionsOnTestset st, data test st.star type)
```

```
print("Accuracy on training set " + str(accuracyTrain st))
          print("Accuracy on test set " + str(accuracyTest st))
          Accuracy on training set 1.0
          Accuracy on test set 1.0
          from sklearn import tree
In [52]:
          import graphviz
          def plot tree classification (model, features, class names):
               # Generate plot data
               dot data = tree.export graphviz (model, out file=None,
                                         feature names=features,
                                         class names=class names,
                                         filled=True, rounded=True,
                                         special characters=True)
               # Turn into graph using graphviz
               graph = graphviz.Source(dot data)
               # Write out a pdf
               graph.render("Trees/decision tree 16")
               # Display in the notebook
               return graph
          plot tree classification(dt classification st, properties st, np.sort(data.star type.uni
In [53]:
                       absolute_magnitude ≤ -7.468
Out[53]:
                              gini = 0.833
                             samples = 168
                      value = [28, 28, 28, 28, 28, 28]
                          class = Brown Dwarf
                                          False
                       True
                                           radius ≤ 0.036
                 gini = 0.0
                                             gini = 0.8
                samples = 28
                                           samples = 140
           value = [0, 28, 0, 0, 0, 0]
                                     value = [28, 0, 28, 28, 28, 28]
             class = Hyper Giant
                                         class = Brown Dwarf
                                                         radius ≤ 0.763
                                gini = 0.0
                                                           gini = 0.75
                              samples = 28
                                                         samples = 112
                         value = [0, 0, 0, 0, 0, 28]
                                                   value = [28, 0, 28, 28, 28, 0]
                           class = White Dwarf
                                                      class = Brown Dwarf
                                    absolute_magnitude ≤ 15.495
                                                                        radius ≤ 11.3
                                             gini = 0.5
                                                                          gini = 0.5
                                                                        samples = 56
                                           samples = 56
                                      value = [28, 0, 0, 28, 0, 0]
                                                                   value = [0, 0, 28, 0, 28, 0]
                                        class = Brown Dwarf
                                                                    class = Main Sequence
                                                                                                   gini = 0.0
                    gini = 0.0
                                              gini = 0.0
                                                                         gini = 0.0
                                            samples = 28
                                                                       samples = 28
                                                                                                 samples = 28
                  samples = 28
             value = [28, 0, 0, 0, 0, 0]
                                       value = [0, 0, 0, 28, 0, 0]
                                                                   value = [0, 0, 28, 0, 0, 0]
                                                                                             value = [0, 0, 0, 0, 28, 0]
                                                                                               class = Super Giant
               class = Brown Dwarf
                                          class = Red Dwarf
                                                                   class = Main Sequence
```

De accuracy is erg hoog voor beide de training en de test set. Ook heeft de decision tree maar een diepte van 4 nodig om deze accuracy tot stand te brengen.

We kunnen ook nog kijken naar kleur, om te zien of het inderdaad klopt dat je moeilijk de kleur kan voorspellen met radius en absolute magnitude.

```
In [54]: star_color = 'star_color'
    data_train_sc, data_test_sc = train_test_split(data, test_size=0.3, random_state=42, str
    dt_classification_sc = DecisionTreeClassifier(max_depth = 10)
    dt_classification_sc.fit(data_train_sc[properties_st], data_train_sc[star_color])

Out[54]: DecisionTreeClassifier(max_depth=10)

In [55]: predictionsOnTrainset_sc = dt_classification_sc.predict(data_train_sc[properties_st])
    predictionsOnTestset_sc = dt_classification_sc.predict(data_test_sc[properties_st]))
    accuracyTrain_sc = calculate_accuracy(predictionsOnTrainset_sc, data_train_sc.star_color)
    accuracyTest_sc = calculate_accuracy(predictionsOnTestset_sc, data_test_sc.star_color)
    print("Accuracy on training set " + str(accuracyTrain_sc))
    print("Accuracy on test set " + str(accuracyTest_sc))

Accuracy on training set 0.9940476190476191
```

Je kan zien dat de accuracy voor de test set een stuk lager is wanneer star color wordt voorspeld met dezelfde kolommen, hier kan dus geen goede fit voor gemaakt worden.