Model obstacles

November 13, 2021

```
[1]: from pandas import *
     # devices
    positions_stations = {"esp20":{"name":"esp20","x":7835,"y":8690.
     →84716796875}, "esp21": {"name": "esp21", "x": 955, "y": 12270.84716796875}, "esp22":
     df = read_csv("device_all.csv")
    df
[1]:
        device
                measure_no
                            rssi
                                  measured_distance
                                                         labelx
                                                                      labely
    0
         esp20
                             -87
                                           4.757198
                                                     3403.97583
                                                                 6959.674805
    1
         esp20
                         1
                             -89
                                           4.757198
                                                     3403.97583
                                                                 6959.674805
    2
         esp20
                         1
                             -87
                                           4.757198
                                                     3403.97583
                                                                 6959.674805
                                                     3403.97583
    3
         esp20
                             -88
                                           4.757198
                                                                 6959.674805
    4
         esp20
                         1
                             -90
                                           4.757198 3403.97583
                                                                 6959.674805
     . .
                         7
                             -96
                                           5.312698 5208.35498 8334.440430
    525
        esp22
    526 esp22
                         7
                             -96
                                           5.312698 5208.35498
                                                                 8334.440430
    527
         esp22
                         7
                             -94
                                           5.312698 5208.35498
                                                                 8334.440430
    528
         esp22
                         7
                             -95
                                           5.312698 5208.35498
                                                                 8334.440430
    529
         esp22
                             -97
                                           5.312698 5208.35498 8334.440430
    [530 rows x 6 columns]
[2]: import math
    df["dx"] = df.apply(lambda row: row['labelx'] -__
     →positions_stations[row['device']]['x'], axis=1)
    df["dy"] = df.apply(lambda row: row['labely'] -__
     →positions_stations[row['device']]['y'], axis=1)
    df["angle"] = df.apply(lambda row: math.atan2(row['dy'] , row['dx']) / math.piu
     \rightarrow* 180, axis=1)
[3]: df
[3]:
        device measure_no
                            rssi measured_distance
                                                         labelx
                                                                      labely \
         esp20
                             -87
                                           4.757198 3403.97583
                                                                6959.674805
    0
```

```
1
          esp20
                                              4.757198 3403.97583
     2
          esp20
                               -87
                                              4.757198
                                                        3403.97583
                                                                     6959.674805
                           1
     3
          esp20
                           1
                               -88
                                              4.757198
                                                         3403.97583
                                                                     6959.674805
     4
          esp20
                           1
                               -90
                                              4.757198
                                                        3403.97583
                                                                     6959.674805
     . .
            •••
                           7
     525
          esp22
                               -96
                                              5.312698
                                                        5208.35498
                                                                     8334.440430
     526
          esp22
                           7
                               -96
                                                                     8334.440430
                                              5.312698
                                                        5208.35498
                           7
     527
          esp22
                               -94
                                              5.312698
                                                        5208.35498
                                                                     8334.440430
                           7
     528
                               -95
          esp22
                                              5.312698
                                                        5208.35498
                                                                     8334.440430
     529
          esp22
                               -97
                                                                     8334.440430
                                              5.312698
                                                        5208.35498
                  dx
                                          angle
                                dy
     0
         -4431.02417 -1731.172363 -158.659735
     1
         -4431.02417 -1731.172363 -158.659735
     2
         -4431.02417 -1731.172363 -158.659735
     3
         -4431.02417 -1731.172363 -158.659735
     4
         -4431.02417 -1731.172363 -158.659735
     . .
     525 -3726.64502 -3786.406738 -134.544257
     526 -3726.64502 -3786.406738 -134.544257
     527 -3726.64502 -3786.406738 -134.544257
     528 -3726.64502 -3786.406738 -134.544257
     529 -3726.64502 -3786.406738 -134.544257
     [530 rows x 9 columns]
[]:
     groupbymeasure = df.groupby(["device", "measure_no"])
[4]:
[5]: g = groupbymeasure.mean()
     g = g.reset_index()
[6]:
    g
[6]:
        device
                                        measured_distance
                                                                  labelx \
                measure_no
                                  rssi
     0
         esp20
                          1 -88.166667
                                                  4.757198
                                                             3403.975830
         esp20
     1
                          3 -84.122449
                                                  3.668797
                                                             7743.078125
     2
         esp20
                          4 -70.346154
                                                             9275.368164
                                                  1.450394
     3
         esp20
                          5 -83.894737
                                                  3.173801
                                                             5766.853516
     4
         esp20
                          6 -98.272727
                                                  2.650715
                                                             5208.354980
     5
         esp20
                          7 -96.700000
                                                  2.650715
                                                             5208.354980
     6
         esp21
                          1 -84.666667
                                                  5.848593
                                                             3403.975830
     7
         esp21
                          2 -88.000000
                                                  4.130146
                                                            4148.640137
     8
         esp21
                                                            7743.078125
                          3 -99.666667
                                                  6.788644
     9
         esp21
                          4 -96.000000
                                                  9.126491
                                                             9275.368164
     10
         esp21
                          5 -87.409091
                                                  4.952658 5766.853516
```

6959.674805

-89

1

```
esp21
                         6 -91.530201
     11
     12
         esp21
                         7 -91.757143
                                                 5.795371
                                                           5208.354980
     13
         esp22
                         1 -94.555556
                                                 7.565046
                                                           3403.975830
     14
         esp22
                         3 -75.450000
                                                 1.215382
                                                           7743.078125
                         4 -87.200000
                                                 3.616294
                                                           9275.368164
     15
         esp22
     16
         esp22
                         5 -87.380952
                                                 3.329080
                                                           5766.853516
         esp22
                         6 -98.000000
     17
                                                 5.312698
                                                           5208.354980
     18
         esp22
                         7 -96.333333
                                                 5.312698
                                                           5208.354980
               labely
                                dx
                                              dy
                                                       angle
     0
          6959.674805 -4431.024170 -1731.172363 -158.659735
     1
         12358.492188
                        -91.921875
                                    3667.645020
                                                   91.435699
     2
          8520.606445
                       1440.368164
                                    -170.240723
                                                   -6.740660
     3
         11098.291016 -2068.146484 2407.443848
                                                 130.664663
     4
          8334.440430 -2626.645020
                                   -356.406738 -172.272788
     5
          8334.440430 -2626.645020 -356.406738 -172.272788
     6
          6959.674805
                       2448.975830 -5311.172363
                                                 -65.245624
     7
          9651.922852
                       3193.640137 -2618.924316
                                                  -39.353248
         12358.492188
                       6788.078125
                                      87.645020
                                                    0.739740
     9
          8520.606445
                       8320.368164 -3750.240723
                                                 -24.262525
     10
        11098.291016
                       4811.853516 -1172.556152
                                                 -13.694973
          8334.440430 4253.354980 -3936.406738
                                                 -42.783728
     11
     12
          8334.440430 4253.354980 -3936.406738
                                                 -42.783728
     13
          6959.674805 -5531.024170 -5161.172363 -136.981118
     14
         12358.492188 -1191.921875
                                      237.645020
                                                 168.724246
     15
          8520.606445
                        340.368164 -3600.240723
                                                 -84.599287
     16
        11098.291016 -3168.146484 -1022.556152 -162.111911
     17
         8334.440430 -3726.645020 -3786.406738 -134.544257
     18
          8334.440430 -3726.645020 -3786.406738 -134.544257
[7]: p = g.pivot(index=["measure_no"],columns=["device"], values=["rssi",_
     →"angle","measured_distance", "labelx", "labely"])
[8]: p = p.reset_index()
[9]: p
[9]:
            measure_no
                                                               angle
                             rssi
     device
                            esp20
                                        esp21
                                                   esp22
                                                               esp20
     0
                     1 -88.166667 -84.666667 -94.555556 -158.659735 -65.245624
     1
                              NaN -88.000000
                                                     NaN
                                                                 NaN -39.353248
                                                           91.435699
     2
                     3 -84.122449 -99.666667 -75.450000
                                                                       0.739740
     3
                     4 -70.346154 -96.000000 -87.200000
                                                           -6.740660 -24.262525
     4
                     5 -83.894737 -87.409091 -87.380952
                                                         130.664663 -13.694973
                     6 -98.272727 -91.530201 -98.000000 -172.272788 -42.783728
     5
     6
                     7 -96.700000 -91.757143 -96.333333 -172.272788 -42.783728
```

5.795371 5208.354980

```
measured_distance
                                                                         labelx \
                                       esp20
      device
                    esp22
                                                 esp21
                                                            esp22
                                                                          esp20
                                              5.848593
      0
             -136.981118
                                   4.757198
                                                         7.565046
                                                                   3403.975830
      1
                      NaN
                                         NaN
                                              4.130146
                                                              NaN
                                                                            NaN
      2
              168.724246
                                   3.668797
                                              6.788644
                                                         1.215382
                                                                   7743.078125
      3
              -84.599287
                                   1.450394
                                              9.126491
                                                         3.616294
                                                                   9275.368164
      4
             -162.111911
                                                         3.329080
                                   3.173801
                                              4.952658
                                                                   5766.853516
      5
             -134.544257
                                   2.650715
                                              5.795371
                                                         5.312698
                                                                   5208.354980
             -134.544257
                                   2.650715 5.795371
                                                         5.312698
                                                                   5208.354980
                                                labely
      device
                                                 esp20
                     esp21
                                   esp22
                                                                esp21
                                                                               esp22
      0
              3403.975830
                            3403.975830
                                           6959.674805
                                                          6959.674805
                                                                         6959.674805
      1
              4148.640137
                                    NaN
                                                   NaN
                                                          9651.922852
                                                                                 NaN
      2
                            7743.078125
                                          12358.492188
                                                                        12358.492188
              7743.078125
                                                         12358.492188
      3
              9275.368164
                            9275.368164
                                           8520.606445
                                                          8520.606445
                                                                        8520.606445
      4
              5766.853516
                            5766.853516
                                          11098.291016
                                                         11098.291016
                                                                        11098.291016
      5
              5208.354980
                            5208.354980
                                           8334.440430
                                                          8334.440430
                                                                         8334.440430
      6
                                           8334.440430
                                                          8334.440430
              5208.354980
                            5208.354980
                                                                         8334.440430
[10]: p.columns
[10]: MultiIndex([(
                           'measure_no',
                                  'rssi', 'esp20'),
                                  'rssi', 'esp21'),
                   (
                                  'rssi', 'esp22'),
                                 'angle', 'esp20'),
                                 'angle', 'esp21'),
                                 'angle', 'esp22'),
                   ('measured_distance', 'esp20'),
                   ('measured_distance', 'esp21'),
                   ('measured_distance', 'esp22'),
                               'labelx', 'esp20'),
                   (
                                'labelx', 'esp21'),
                   (
                                'labelx', 'esp22'),
                   (
                                'labely', 'esp20'),
                   (
                                'labely', 'esp21'),
                                'labely', 'esp22')],
                 names=[None, 'device'])
[11]: p["rssi", "esp20"]
[11]: 0
          -88.166667
      1
                 NaN
      2
          -84.122449
      3
          -70.346154
          -83.894737
```

```
5
         -98.272727
         -96.700000
      6
      Name: (rssi, esp20), dtype: float64
[12]: flatp = p.copy()
      flatp.columns = ['_'.join(col).strip() for col in p.columns.values]
[13]: flatp.columns
[13]: Index(['measure_no_', 'rssi_esp20', 'rssi_esp21', 'rssi_esp22', 'angle_esp20',
             'angle_esp21', 'angle_esp22', 'measured_distance_esp20',
             'measured_distance_esp21', 'measured_distance_esp22', 'labelx_esp20',
             'labelx_esp21', 'labelx_esp22', 'labely_esp20', 'labely_esp21',
             'labely_esp22'],
            dtype='object')
[14]: flatp = flatp.drop(["labelx_esp20", "labelx_esp21", "labelx_esp22", "

¬"labely_esp20", "labely_esp21", "labely_esp22"], axis=1)

[15]: flatp = flatp.dropna()
[16]: flatp
「16]:
        measure no rssi esp20 rssi esp21 rssi esp22 angle esp20
                                                                      angle esp21 \
      0
                   1 -88.166667 -84.666667 -94.555556 -158.659735
                                                                        -65.245624
     2
                  3 -84.122449 -99.666667 -75.450000
                                                            91.435699
                                                                          0.739740
                  4 -70.346154 -96.000000 -87.200000
      3
                                                           -6.740660
                                                                        -24.262525
                  5 -83.894737 -87.409091 -87.380952
                                                           130.664663
                                                                       -13.694973
                  6 -98.272727 -91.530201 -98.000000 -172.272788
      5
                                                                        -42.783728
      6
                  7 -96.700000 -91.757143 -96.333333 -172.272788
                                                                       -42.783728
        angle_esp22 measured_distance_esp20 measured_distance_esp21 \
      0 -136.981118
                                    4.757198
                                                              5.848593
         168.724246
                                    3.668797
                                                              6.788644
      3
         -84.599287
                                    1.450394
                                                              9.126491
      4 -162.111911
                                    3.173801
                                                             4.952658
      5 -134.544257
                                    2.650715
                                                             5.795371
      6 -134.544257
                                    2.650715
                                                             5.795371
        measured_distance_esp22
      0
                       7.565046
      2
                       1.215382
      3
                       3.616294
      4
                       3.329080
      5
                       5.312698
      6
                       5.312698
```

```
[17]: y_columns = ["measured_distance_esp20", "measured_distance_esp21", __
      removed = ["measure_no_", "angle_esp20", "angle_esp21", "angle_esp22"]
[18]: # creating the X numpy
     keepX = filter(lambda x:not x in y_columns, flatp.columns.values)
     keepX = filter(lambda x:not x in removed, keepX)
     keepX = list(keepX)
     print(keepX)
     print(type(keepX))
     print(type(y_columns))
     X = flatp[keepX].copy()
     MX = X.to_numpy()
     Y = flatp[y_columns].copy()
     MY = Y.to_numpy()
     ['rssi_esp20', 'rssi_esp21', 'rssi_esp22']
     <class 'list'>
     <class 'list'>
[19]: X
[19]:
        rssi_esp20 rssi_esp21 rssi_esp22
     0 -88.166667 -84.666667 -94.555556
     2 -84.122449 -99.666667 -75.450000
     3 -70.346154 -96.000000 -87.200000
     4 -83.894737 -87.409091 -87.380952
     5 -98.272727 -91.530201 -98.000000
     6 -96.700000 -91.757143 -96.333333
[20]: Y
[20]:
        measured_distance_esp20 measured_distance_esp21 measured_distance_esp22
                       4.757198
     0
                                                5.848593
                                                                        7.565046
     2
                       3.668797
                                                6.788644
                                                                        1.215382
     3
                       1.450394
                                                9.126491
                                                                        3.616294
     4
                       3.173801
                                                4.952658
                                                                        3.329080
     5
                       2.650715
                                               5.795371
                                                                        5.312698
     6
                       2.650715
                                               5.795371
                                                                        5.312698
[21]: MX
```

```
[21]: array([[-88.16666667, -84.66666667, -94.55555556],
             [-84.12244898, -99.66666667, -75.45
                                                       ],
             [-70.34615385, -96.
                                        , -87.2
                                                       ],
             [-83.89473684, -87.40909091, -87.38095238],
             [-98.27272727, -91.53020134, -98.
                          , -91.75714286, -96.33333333]])
             [-96.7]
[22]: MY
[22]: array([[4.75719801, 5.84859252, 7.5650465],
             [3.66879675, 6.78864392, 1.2153818],
             [1.45039386, 9.12649067, 3.6162942],
             [3.17380147, 4.95265809, 3.32907994],
             [2.65071496, 5.79537114, 5.31269791],
             [2.65071496, 5.79537114, 5.31269791]])
 []:
[23]: from sklearn.model_selection import train_test_split
      X_train, X_test, y_train, y_test = train_test_split(X, Y, test_size=0.2)
[24]: MY
[24]: array([[4.75719801, 5.84859252, 7.5650465],
             [3.66879675, 6.78864392, 1.2153818],
             [1.45039386, 9.12649067, 3.6162942],
             [3.17380147, 4.95265809, 3.32907994],
             [2.65071496, 5.79537114, 5.31269791],
             [2.65071496, 5.79537114, 5.31269791]])
[25]: from sklearn.linear_model import Ridge
      from sklearn.preprocessing import PolynomialFeatures
      from sklearn.pipeline import make_pipeline
      degre = 2
      model = make_pipeline(PolynomialFeatures(degre), Ridge())
      print(type(model))
      model.fit(MX, MY)
      Y_pred = model.predict(MX)
     <class 'sklearn.pipeline.Pipeline'>
[26]: Y_pred
[26]: array([[4.75668209, 5.84828106, 7.56367942],
             [3.66873494, 6.78860696, 1.21527032],
```

```
[1.4504242, 9.12650815, 3.61638183],
             [3.1744283 , 4.95303786, 3.33079045],
             [2.65279475, 5.79663074, 5.31909184],
             [2.64855574, 5.79406269, 5.3059844]])
[27]: # check precision / dispersion
      MY - Y_pred
[27]: array([[ 5.15925316e-04, 3.11459953e-04, 1.36707632e-03],
             [ 6.18115773e-05, 3.69570232e-05, 1.11475378e-04],
             [-3.03371460e-05, -1.74798583e-05, -8.76253358e-05],
             [-6.26835123e-04, -3.79769585e-04, -1.71051077e-03],
             [-2.07978470e-03, -1.25960940e-03, -6.39392976e-03],
             [ 2.15922008e-03, 1.30844187e-03, 6.71351418e-03]])
[28]: model.predict([[-90,-90,-80]])
[28]: array([[ 1.1520523 , 1.83776936, -6.05578789]])
[29]: # save model to disk with all devices
      import pickle
      filename = 'model_esp20_esp21_esp22.sav'
      pickle.dump(model, open(filename, 'wb'))
 []:
[30]: # Create model for all combinaisons
      def combinaison(a, n):
          ret = []
          toRemove = len(a) - n
          if toRemove > 0:
              for i in range(0,len(a)):
                  r = a.copy()
                  r.remove(a[i])
                  result = combinaison(r, n)
                  for j in result:
                      if not j in ret:
                          ret.append(j)
              ret.append(a)
          return ret
```

```
[31]: alldevices = list(positions_stations.keys())
      import joblib
      import sklearn
      print(sklearn.__version__)
      for i in alldevices:
          label = "rssi_" + i
          dfx = g[g["device"] == i]["rssi"]
          dfy = g[g["device"] == i]["measured_distance"]
          fx = dfx.to_numpy().reshape(-1,1)
          fy = dfy.to_numpy().reshape(-1,1)
          print(fx)
          print(fy)
          degre = 2
          model = make_pipeline(PolynomialFeatures(degre), Ridge())
          model.fit(fx, fy)
          Y_pred = model.predict(fx)
          print(Y_pred)
          print("result fit")
          print(Y_pred - fy)
          filename = 'model_' + i + '.sav'
          joblib.dump(model, filename)
     0.24.2
```

```
[[-88.16666667]
[-84.12244898]
[-70.34615385]
[-83.89473684]
[-98.27272727]
[-96.7]
              ]]
[[4.75719801]
[3.66879675]
[1.45039386]
[3.17380147]
[2.65071496]
[2.65071496]]
[[3.56157393]
[3.49162853]
[1.82615776]
[3.48203505]
[2.90501473]
[3.08521003]]
```

result fit

- [[-1.19562409]
- [-0.17716823]
- [0.3757639]
- [0.30823358]
- [0.25429977]
- [0.43449507]]
- [[-84.6666667]
- [-88.
- [-99.66666667]
- [-96.
- [-87.40909091]
- [-91.53020134]
- [-91.75714286]]
- [[5.84859252]
- [4.13014551]
- [6.78864392]
- [9.12649067]
- [4.95265809]
- [5.79537114]
- [5.79537114]]
- [[4.78132496]
- [5.39744627]
- [7.77526884]
- [6.99084265]
- [5.28617459]
- [6.08060965]
- [6.12560601]]
- result fit
- [[-1.06726756]
- [1.26730076]
- [0.98662492]
- [-2.13564801]
- [0.33351649]
- [0.28523851]
- [0.33023488]]
- [[-94.5555556]

]

]

- [-75.45]
- [-87.2
- [-87.38095238]
- [-98.
- [-96.33333333]]
- [[7.5650465]
- [1.2153818]
- [3.6162942]
- [3.32907994]
- [5.31269791]
- [5.31269791]]
- [[5.45115263]

- [1.18401636]
- [3.79367902]
- [3.83423417]
- [6.23361432]
- [5.85450176]]

result fit

- [[-2.11389387]
- [-0.03136544]
- [0.17738482]
- [0.50515423]
- [0.92091641]
- [0.54180385]]

[]: