February 4, 2021

1 KNN: K-nearest neighbor

In this case we work with *irregular data*, meaning that the dataset was not previously prepared for as in a nice csv file with no missing values and no wrong values.

```
[1]: import pandas as pd
import numpy as np
import sklearn
from sklearn import linear_model, preprocessing
from sklearn.utils import shuffle
from sklearn.neighbors import KNeighborsClassifier
import os
```

1.1 Read the data

```
[2]: dir_here = os.path.abspath("")
    dir_base = os.path.dirname(dir_here)
    dir_data = os.path.join(dir_base, "data")
    path_data_csv = os.path.join(dir_data, "car.data")
    print(path_data_csv)
```

/home/dancab/git/TWT-ML-Tutorial/data/car.data

```
[3]: names = ["buying", "maint", "door", "persons", "lug_boot", "safety", "class"]
data = pd.read_csv(path_data_csv, header=None, names=names)
print(data.head())
```

```
buying maint door persons lug_boot safety
                                            class
0 vhigh vhigh
                  2
                          2
                               small
                                        low unacc
1 vhigh vhigh
                  2
                          2
                               small
                                       med unacc
2 vhigh vhigh
                  2
                          2
                                       high unacc
                               small
                  2
                          2
3 vhigh vhigh
                                        low unacc
                                 med
                          2
4 vhigh vhigh
                  2
                                 med
                                        med unacc
```

1.2 Normalize the data

The dataset contains fields that are non-numerical. For example: 'safety' can be 'low', 'med', 'high'.

To process this data it is better to previously convert it (*preprocess* it) to numerical values. For instance, 'low'=0, 'med'=1, 'high'=2.

To do that, sklearn offers the module 'preprocessing' that we already imported. Another alternative would be to do it ourselves, which wouldn't be that hard either.

```
[4]: # Create a LabelEncoder object
     le = preprocessing.LabelEncoder()
     # It takes lists as inputs instead of pd.Series or np.arrays so:
     buying = le.fit_transform(list(data["buying"]))
     maint = le.fit_transform(list(data["maint"]))
     door = le.fit_transform(list(data["door"]))
     persons = le.fit_transform(list(data["persons"]))
     lug boot = le.fit transform(list(data["lug boot"]))
     safety = le.fit_transform(list(data["safety"]))
     car class = le.fit transform(list(data["class"]))
     # Create new dataframe to visualize better this transformation
     df_le = pd.DataFrame(
         {
             'buying': buying,
             'maint': maint,
             'door': door,
             'persons': persons,
             'lug_boot': lug_boot,
             'safety': safety,
             'class': car_class
         }
     print(df_le.head())
```

	buying	maint	door	persons	lug_boot	safety	class
0	3	3	0	0	2	1	2
1	3	3	0	0	2	2	2
2	3	3	0	0	2	0	2
3	3	3	0	0	1	1	2
4	3	3	0	0	1	2	2

It converted the values to numeric categories.

It seems that the order is alphabetical. That's why in the 'safety' field, 'low'=1, 'med'=2, but 'high'=0.

1.2.1 Split data between train and test batches

```
# Check it out
n = 30 if len(x_train)>30 else len(x_train)
for k in range(n):
    x_str = " ; ".join(f"{val:2d}" for val in x_train[k])
    print(x_str + " | " + f"{y_train[k]:2d}")
```

```
2;
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                         1
    1;
          3
               2;
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         3;
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                    0
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          1;
```

1.3 Create the KNN Model

```
[6]: model = KNeighborsClassifier(n_neighbors=5)
```

n_neighbors is the k number of nearest neighbors to look.

It is a *hyperparameter*:

In machine learning, a hyperparameter is a parameter whose value is used to control the learning process.

By contrast, the values of other parameters (typically node weights) are derived via training. Source: Wikipedia's entry for hyperparameter

In this case we set it as 5 but we should play with it to see the differences in results.

1.3.1 Fit the model

```
[7]: # Let's do a single fit and check the accuracy
model.fit(x_train, y_train)
acc = model.score(x_test, y_test)
print(acc)
```

0.8959537572254336

```
[8]: # Let's see with a changed n_neighbors
model = KNeighborsClassifier(n_neighbors=7)
model.fit(x_train, y_train)
acc = model.score(x_test, y_test)
print(acc)
```

0.9132947976878613

```
[9]: # Let's see with a changed n_neighbors
model = KNeighborsClassifier(n_neighbors=9)
model.fit(x_train, y_train)
acc = model.score(x_test, y_test)
print(acc)
```

0.9075144508670521

It seems 7 was the best option, let's run it again

```
[10]: # Let's see with a changed n_neighbors
model = KNeighborsClassifier(n_neighbors=7)
model.fit(x_train, y_train)
acc = model.score(x_test, y_test)
print(acc)
```

0.9132947976878613

1.3.2 Predict

```
[11]: predicted = model.predict(x_test)
names = ["unacc", "acc", "good", "vgood"]
# Tim uses this names in this order, I'm not so sure about the order, so I_\(\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\tex
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             2 Data:
                                                     2
                       (1, 3, 1, 0, 0, 1) Actual:
                                                     2
Predicted:
             2 Data:
Predicted:
             2 Data:
                       (2, 1, 0, 0, 2, 1) Actual:
                                                     2
Predicted:
                       (3, 2, 0, 1, 0, 0) Actual:
             0 Data:
                                                     0
Predicted:
             2 Data:
                       (3, 3, 0, 2, 0, 1) Actual:
                                                     2
Predicted:
             2 Data:
                       (2, 3, 0, 0, 1, 2) Actual:
                                                     2
Predicted:
                       (0, 3, 3, 2, 2, 0) Actual:
                                                     2
             2 Data:
```

```
Predicted: 2 Data:
                    (2, 1, 0, 0, 1, 2) Actual:
Predicted: 2 Data: (3, 1, 1, 2, 0, 1) Actual:
                                                2
Predicted: 2 Data: (2, 3, 3, 1, 2, 1) Actual:
                                                2
Predicted: 2 Data: (3, 0, 3, 2, 0, 1) Actual:
Predicted: 1 Data: (1, 1, 2, 2, 2, 0) Actual:
Predicted: 2 Data: (0, 1, 0, 0, 1, 1) Actual:
Predicted: 2 Data: (2, 3, 3, 0, 2, 0) Actual:
Predicted: 0 Data: (1, 3, 3, 2, 2, 0) Actual:
                                                0
Predicted: 2 Data: (1, 1, 2, 1, 2, 1) Actual:
                                                2
Predicted: 2 Data: (2, 0, 2, 0, 0, 0) Actual:
Predicted: 2 Data: (3, 1, 0, 1, 1, 2) Actual:
Predicted: 2 Data: (1, 3, 0, 0, 2, 1) Actual:
Predicted: 2 Data: (0, 2, 0, 0, 2, 2) Actual:
Predicted: 2 Data: (2, 2, 1, 1, 2, 2) Actual:
                    (3, 2, 1, 2, 1, 2) Actual:
Predicted: 2 Data:
                                                0
Predicted: 2 Data: (1, 3, 3, 0, 0, 2) Actual:
                                                2
Predicted: 2 Data: (1, 3, 2, 2, 2, 2) Actual:
Predicted: 2 Data: (2, 1, 0, 2, 1, 2) Actual:
                                                0
Predicted: 0 Data: (2, 3, 2, 2, 2, 0) Actual:
Predicted: 0 Data: (2, 3, 1, 2, 0, 0) Actual:
                                                0
Predicted: 2 Data: (1, 2, 3, 0, 0, 0) Actual:
Predicted: 2 Data: (2, 2, 3, 1, 1, 1) Actual:
Predicted: 2 Data: (1, 0, 3, 1, 1, 1) Actual:
                                                2
Predicted: 2 Data: (2, 1, 3, 2, 1, 1) Actual:
                                                2
Predicted: 2 Data: (3, 1, 3, 1, 0, 1) Actual:
                                                2
                    (2, 2, 1, 0, 1, 0) Actual:
Predicted: 2 Data:
                    (2, 1, 2, 2, 1, 2) Actual:
Predicted: 1 Data:
```

1.3.3 Print k-nearest neighbors of each point

```
[12]: for k in range(len(predicted)):
    n = model.kneighbors([x_test[k]], 7, True)
    print("---")
    print(f"{k:03d}")
    print("Distances: ", n[0].tolist())
    print("Indexes: ", n[1].tolist())

---
000
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[141, 207, 1142, 916, 528, 1279, 857]]
---
001
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[488, 216, 1315, 894, 597, 714, 320]]
---
002
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.4142135623730951, 1.4142135623730951]]
```

```
[[1087, 1052, 297, 1222, 39, 928, 135]]
Indexes:
---
003
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[39, 630, 1187, 1186, 108, 1087, 72]]
004
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[1521, 1102, 0, 694, 198, 1139, 678]]
005
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[1538, 1277, 945, 293, 1381, 1096, 1051]]
___
006
Distances: [[1.0, 1.0, 1.0, 1.0, 1.4142135623730951, 1.4142135623730951]]
Indexes: [[842, 229, 1133, 1165, 1280, 1074, 690]]
007
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[758, 577, 1232, 830, 326, 741, 109]]
---
800
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[924, 690, 1226, 1069, 988, 1213, 1276]]
009
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[970, 1353, 1045, 1479, 1318, 1466, 847]]
---
010
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[29, 880, 107, 444, 466, 1499, 825]]
___
011
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[1096, 580, 1041, 1272, 983, 1051, 871]]
012
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[1461, 1410, 227, 666, 397, 739, 172]]
___
013
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[888, 845, 707, 1373, 279, 1508, 160]]
---
014
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.4142135623730951]]
```

```
[[325, 27, 817, 1516, 1317, 380, 354]]
Indexes:
---
015
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[868, 414, 567, 83, 703, 1467, 1057]]
016
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[1447, 1265, 225, 1015, 1258, 763, 500]]
017
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[1224, 916, 692, 434, 1363, 107, 857]]
___
018
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[1220, 1551, 1039, 562, 747, 1415, 554]]
019
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[223, 479, 1300, 590, 1178, 1205, 404]]
___
020
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[949, 1513, 1404, 87, 156, 352, 1380]]
021
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.4142135623730951]]
Indexes: [[1120, 245, 1457, 1368, 390, 461, 37]]
---
022
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[200, 227, 608, 515, 1270, 271, 1263]]
___
023
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[490, 487, 1127, 1175, 676, 270, 1047]]
024
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[755, 1503, 970, 1318, 132, 323, 197]]
___
025
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.4142135623730951]]
Indexes: [[343, 288, 1032, 1554, 1540, 931, 25]]
---
026
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
```

```
Indexes: [[261, 776, 463, 219, 23, 398, 1267]]
---
027
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[1338, 416, 57, 59, 1434, 439, 926]]
028
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[1007, 1449, 1009, 1458, 1421, 415, 1366]]
029
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[779, 607, 715, 685, 319, 1074, 1046]]
---
030
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[384, 1198, 1106, 106, 422, 646, 659]]
---
031
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.4142135623730951]]
Indexes: [[1008, 541, 969, 854, 1553, 488, 260]]
___
032
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[59, 254, 1338, 1541, 874, 1253, 1483]]
033
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[1340, 1115, 1306, 30, 468, 1419, 271]]
---
034
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[1293, 363, 410, 302, 621, 382, 1303]]
___
035
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[1022, 944, 562, 1527, 1004, 364, 424]]
036
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[557, 454, 895, 243, 1553, 1094, 539]]
___
037
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[338, 1040, 1487, 588, 276, 342, 985]]
---
038
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
```

```
Indexes: [[1450, 959, 368, 942, 757, 233, 936]]
---
039
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[1391, 585, 676, 657, 1371, 1353, 95]]
040
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[623, 1427, 491, 571, 746, 212, 1063]]
041
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.4142135623730951]]
Indexes: [[778, 965, 1319, 205, 124, 238, 10]]
---
042
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[286, 1341, 999, 404, 835, 1176, 1207]]
___
043
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[1333, 15, 180, 1371, 635, 657, 918]]
___
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[492, 1005, 1388, 664, 973, 326, 741]]
045
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.4142135623730951]]
Indexes: [[640, 685, 737, 690, 609, 1074, 806]]
---
046
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[116, 432, 542, 1246, 1314, 447, 958]]
___
047
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[1050, 583, 642, 541, 129, 854, 1389]]
048
Distances: [[1.0, 1.0, 1.0, 1.0, 1.4142135623730951, 1.4142135623730951]]
Indexes: [[1113, 589, 1215, 983, 1272, 528, 1047]]
___
049
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[188, 1401, 259, 84, 139, 1256, 1412]]
---
050
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
```

```
[[189, 273, 383, 1112, 1352, 486, 993]]
Indexes:
---
051
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[785, 1547, 637, 261, 381, 280, 308]]
052
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.4142135623730951]]
Indexes: [[1223, 472, 1323, 1535, 81, 595, 1448]]
053
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[473, 1083, 725, 242, 262, 157, 489]]
---
054
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[467, 392, 1315, 776, 1091, 894, 16]]
055
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[1342, 1122, 1438, 572, 72, 1187, 781]]
___
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[1304, 965, 706, 355, 1062, 1104, 238]]
057
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[549, 955, 468, 417, 372, 1419, 402]]
---
058
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[364, 1122, 1373, 662, 1110, 424, 160]]
___
059
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[1467, 102, 309, 677, 1518, 517, 347]]
060
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[667, 118, 1320, 6, 1313, 1018, 250]]
___
061
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[337, 155, 219, 780, 398, 317, 161]]
---
062
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.4142135623730951]]
```

```
Indexes: [[1450, 1079, 957, 757, 1055, 1407, 514]]
---
063
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[90, 172, 961, 881, 1546, 743, 1410]]
064
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.4142135623730951]]
Indexes: [[1030, 815, 407, 1181, 716, 1455, 1506]]
065
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[1298, 1262, 1530, 1010, 75, 745, 848]]
---
066
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[35, 1236, 970, 847, 132, 860, 1044]]
___
067
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[865, 1433, 1376, 1107, 533, 457, 1431]]
___
068
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.4142135623730951]]
Indexes: [[407, 815, 1316, 1080, 1409, 9, 368]]
069
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[63, 155, 766, 17, 748, 1250, 782]]
---
070
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.4142135623730951]]
Indexes: [[1329, 947, 1082, 981, 1193, 5, 1052]]
___
071
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.4142135623730951]]
Indexes: [[644, 391, 570, 74, 297, 1124, 835]]
072
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[1174, 596, 339, 1076, 873, 50, 263]]
___
073
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[1437, 758, 65, 1089, 1238, 1092, 1400]]
---
074
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
```

```
Indexes: [[1020, 1232, 12, 577, 582, 130, 411]]
---
075
Distances: [[1.0, 1.0, 1.0, 1.0, 1.4142135623730951, 1.4142135623730951]]
Indexes: [[847, 132, 1318, 839, 1146, 409, 1316]]
076
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[677, 400, 988, 1178, 309, 112, 97]]
077
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[863, 1320, 653, 117, 756, 118, 885]]
---
078
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[951, 310, 120, 363, 347, 1303, 868]]
079
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[538, 1213, 141, 1276, 974, 925, 1279]]
___
080
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[392, 16, 530, 1185, 746, 1063, 1336]]
081
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[639, 771, 1257, 1153, 28, 1064, 247]]
---
082
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[932, 1313, 1498, 352, 475, 118, 885]]
___
083
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[1243, 477, 1384, 1296, 151, 179, 1147]]
084
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[381, 343, 11, 1536, 736, 249, 785]]
___
085
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[1357, 1211, 128, 464, 1115, 1263, 125]]
---
086
```

Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]

```
[[1360, 1282, 974, 633, 374, 925, 325]]
Indexes:
---
087
Distances: [[1.0, 1.0, 1.0, 1.0, 1.4142135623730951, 1.4142135623730951]]
Indexes: [[1426, 791, 1078, 1504, 808, 829, 841]]
088
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[60, 893, 767, 208, 506, 370, 32]]
089
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[181, 1133, 1073, 842, 1085, 858, 687]]
___
090
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[311, 527, 1315, 446, 597, 115, 480]]
091
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[1387, 303, 772, 1217, 137, 695, 1301]]
___
092
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[686, 230, 976, 1203, 1403, 750, 102]]
093
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[673, 188, 600, 415, 120, 139, 868]]
---
094
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[105, 1539, 1472, 1090, 1378, 1216, 1413]]
___
095
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[1279, 513, 1360, 974, 567, 1518, 453]]
096
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[1431, 1260, 1508, 1538, 1255, 1433, 932]]
___
097
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[1492, 1206, 873, 1288, 1512, 1410, 99]]
---
098
Distances: [[1.0, 1.0, 1.0, 1.0, 1.4142135623730951, 1.4142135623730951]]
```

```
Indexes: [[331, 1240, 829, 828, 537, 1028, 1209]]
---
099
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[1173, 844, 1552, 1291, 1374, 1069, 886]]
100
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.4142135623730951]]
Indexes: [[1221, 454, 38, 1427, 697, 1131, 373]]
101
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[893, 1166, 1240, 1342, 591, 829, 72]]
---
102
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.4142135623730951]]
Indexes: [[1207, 1028, 975, 721, 1209, 286, 841]]
___
103
Distances: [[1.0, 1.0, 1.0, 1.0, 1.4142135623730951, 1.4142135623730951]]
Indexes: [[1240, 1052, 433, 893, 370, 122, 1361]]
___
104
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.4142135623730951]]
Indexes: [[551, 33, 419, 331, 849, 954, 176]]
105
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[696, 635, 1321, 676, 1371, 1017, 123]]
---
106
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[558, 154, 165, 795, 521, 88, 1048]]
___
107
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.4142135623730951]]
Indexes: [[307, 482, 865, 611, 1043, 61, 992]]
108
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[13, 96, 850, 218, 1154, 896, 1287]]
---
109
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
Indexes: [[1070, 628, 1244, 1545, 66, 966, 755]]
---
110
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
```

```
Indexes: [[1315, 398, 1355, 446, 780, 1056, 714]]
---
111
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113
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114
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115
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117
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118
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119
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120
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121
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125
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.0, 1.0]]
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126
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128
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129
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130
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131
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134
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136
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137
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138
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141
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142
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143
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144
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146
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147
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148
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149
Distances: [[1.0, 1.0, 1.0, 1.0, 1.0, 1.4142135623730951]]
Indexes: [[236, 798, 286, 122, 1176, 1542, 591]]
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150
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151
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153
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154
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155
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157
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158
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160
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161
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162
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163
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166
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167
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168
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169
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170
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171
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172

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