Pythagorean Fuzzy TODIM Ranking

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```
[1]: import pfn  # for fuzzy types
import math  # for sqrt and other functions
import numpy as np  # for linear algebra
import pandas as pd  # for tabular output
from scipy.stats import rankdata # for ranking the candidates
```

1 Step 0 - Obtaining and preprocessing data

```
[2]: attributes_data = pd.read_csv('../data/criteria.csv')
attributes_data

[2]: Criteria Name Rank Ideally
```

```
Price
                                      Price
                                                3
                                                    Lower
1
  Quality
                                    Quality
                                                5 Higher
2
       EC
                         Energy Consumption
                                                2 Lower
3
       GD
                               Green Design
                                                1 Higher
       DS
4
                             Delivery Speed
                                                6 Higher
5
       CSR
           Corporate Social Responsibility
                                                4 Higher
       EE
                         Employee Education
                                                7 Higher
```

```
[3]: benefit_attributes = set()
attributes = []
rankings = []
n = 0

for i, row in attributes_data.iterrows():
    attributes.append(row['Criteria'])
    rankings.append(row['Rank'])
    n += 1

    if row['Ideally'] == 'Higher':
        benefit_attributes.add(i)
```

```
[4]: pd.DataFrame(attributes, columns=['Criteria Name'])
```

```
[4]: Criteria Name
0 Price
```

```
1
             Quality
     2
                   EC
     3
                  GD
     4
                  DS
     5
                  CSR
     6
                  EE
[5]: rankings = np.array(rankings)
     weights = 2 * (n + 1 - rankings) / (n * (n + 1))
     pd.DataFrame(weights, columns=['Weights'])
[5]:
         Weights
     0 0.178571
     1 0.107143
     2 0.214286
     3 0.250000
     4 0.071429
     5 0.142857
     6 0.035714
[6]: original_dataframe = pd.read_csv('../data/alternatives (fuzzy).csv')
     candidates = list(original_dataframe['Name'])
     raw_data = pd.DataFrame(original_dataframe, columns=attributes).values.tolist()
     m = len(raw_data)
     n = len(raw_data[0])
     pd.DataFrame(data=raw_data, index=candidates, columns=attributes)
[6]:
                Price
                           Quality
                                               EC
                                                           GD
                                                                          DS
                                                                             \
                                                      (.8,.1)
     S1
           (.085,.01)
                         (.68,.08)
                                     (.6375,.075)
                                                               (.2125,.025)
     S2
         (.2125,.025)
                         (.17,.02)
                                         (.85,.1)
                                                    (.64,.08)
                                                               (.2125,.025)
     S3
             (.85,.1)
                        (.085,.01)
                                     (.6375,.075)
                                                    (.51,.06)
                                                               (.2125,.025)
                                     (.6375,.075)
                                                    (.85,.1)
     S4
           (.085,.01)
                          (.85,.1)
                                                                    (.8,.1)
     S5
           (.425,.05)
                         (.34,.04)
                                         (.85,.1)
                                                    (.51,.06)
                                                               (.2125,.025)
                        (.51, .061)
                                     (.6375,.075)
                                                    (.68,.08)
     S6
           (.065,.01)
                                                                   (.85,.1)
                CSR
                                EE
           (.7,.08)
                          (.85,.1)
     S1
     S2
          (.75,.08)
                      (.6375,.075)
     S3
         (.65,.076)
                      (.6375,.075)
     S4
           (.85,.1)
                          (.85,.1)
     S5
          (.75,.08)
                      (.6375,.075)
     S6
           (.85,.1)
                          (.85,.1)
```

```
[7]: raw_data = [[pfn.parse_pfn(item) for item in row] for row in raw_data]
     pd.DataFrame(data=raw_data, index=candidates, columns=attributes)
[7]:
                    Price
                                  Quality
                                                         EC
                                                                        GD
                                                                            \
     S1
           (0.085, 0.01)
                             (0.68, 0.08)
                                            (0.6375, 0.075)
                                                                (0.8, 0.1)
                             (0.17, 0.02)
     S2
         (0.2125, 0.025)
                                                (0.85, 0.1)
                                                              (0.64, 0.08)
     S3
              (0.85, 0.1)
                            (0.085, 0.01)
                                            (0.6375, 0.075)
                                                              (0.51, 0.06)
           (0.085, 0.01)
     S4
                              (0.85, 0.1)
                                            (0.6375, 0.075)
                                                               (0.85, 0.1)
     S5
           (0.425, 0.05)
                             (0.34, 0.04)
                                                (0.85, 0.1)
                                                              (0.51, 0.06)
     S6
           (0.065, 0.01)
                            (0.51, 0.061)
                                            (0.6375, 0.075)
                                                              (0.68, 0.08)
                       DS
                                      CSR
                                                         EE
         (0.2125, 0.025)
                              (0.7, 0.08)
     S1
                                                (0.85, 0.1)
     S2
         (0.2125, 0.025)
                             (0.75, 0.08)
                                            (0.6375, 0.075)
                            (0.65, 0.076)
     S3
         (0.2125, 0.025)
                                            (0.6375, 0.075)
     S4
               (0.8, 0.1)
                              (0.85, 0.1)
                                                (0.85, 0.1)
     S5
         (0.2125, 0.025)
                             (0.75, 0.08)
                                            (0.6375, 0.075)
     S6
              (0.85, 0.1)
                              (0.85, 0.1)
                                                (0.85, 0.1)
        Step 1 - Normalizing the ratings and weights
[8]: for j in range(n):
         if j not in benefit_attributes:
              for i in range(m):
                  raw_data[i][j] = -raw_data[i][j]
     pd.DataFrame(data=raw_data, index=candidates, columns=attributes)
[8]:
                    Price
                                  Quality
                                                         EC
                                                                        GD
                                                                            \
     S1
           (0.01, 0.085)
                             (0.68, 0.08)
                                            (0.075, 0.6375)
                                                                (0.8, 0.1)
     S2
         (0.025, 0.2125)
                             (0.17, 0.02)
                                                (0.1, 0.85)
                                                              (0.64, 0.08)
     S3
              (0.1, 0.85)
                            (0.085, 0.01)
                                            (0.075, 0.6375)
                                                              (0.51, 0.06)
           (0.01, 0.085)
                              (0.85, 0.1)
                                            (0.075, 0.6375)
                                                               (0.85, 0.1)
     S4
     S5
           (0.05, 0.425)
                             (0.34, 0.04)
                                                (0.1, 0.85)
                                                              (0.51, 0.06)
     S6
           (0.01, 0.065)
                            (0.51, 0.061)
                                            (0.075, 0.6375)
                                                              (0.68, 0.08)
                       DS
                                      CSR
                                                         EE
         (0.2125, 0.025)
                              (0.7, 0.08)
     S1
                                                (0.85, 0.1)
     S2
         (0.2125, 0.025)
                             (0.75, 0.08)
                                            (0.6375, 0.075)
                            (0.65, 0.076)
     S3
         (0.2125, 0.025)
                                            (0.6375, 0.075)
     S4
               (0.8, 0.1)
                              (0.85, 0.1)
                                                (0.85, 0.1)
     S5
         (0.2125, 0.025)
                             (0.75, 0.08)
                                            (0.6375, 0.075)
              (0.85, 0.1)
     S6
                              (0.85, 0.1)
                                                (0.85, 0.1)
[9]: | max_weight = max(weights)
     for i in range(n):
```

```
weights[i] /= max_weight
     pd.DataFrame(data=weights, index=attributes, columns=['Weight'])
 [9]:
                Weight
     Price
              0.714286
     Quality 0.428571
     EC
              0.857143
     GD
              1.000000
     DS
              0.285714
     CSR
              0.571429
     EE
              0.142857
         Step 2 - Calculating Dominance Degrees
[10]: # The loss attenuation factor
     theta = 2.5
```

```
phi = np.zeros((n, m, m))

weight_sum = sum(weights)

for c in range(n):
    for i in range(m):
        pic = raw_data[i][c]
        pjc = raw_data[j][c]
        val = 0
        if pic > pjc:
            val = math.sqrt((pic.distance(pjc)) * weights[c] / weight_sum)
        if pic < pjc:
            val = -1.0 / theta * math.sqrt(weight_sum * pic.distance(pjc) /
        weights[c])
        phi[c][i][j] = val</pre>
```

```
[12]: delta = np.zeros((m, m))
    for i in range(m):
        for j in range(m):
            delta[i,j] = sum(phi[:,i,j])

pd.DataFrame(data=delta, index=candidates, columns=candidates)
```

```
[12]: S1 S2 S3 S4 S5 S6
S1 0.000000 0.622632 1.094783 -2.526386 0.762338 -1.440690
S2 -2.957800 0.000000 0.245667 -4.921384 -0.010759 -4.309130
S3 -3.595614 -1.408338 0.000000 -5.321140 -1.238177 -4.794761
```

```
$4 0.701042 1.363427 1.498947 0.000000 1.500441 -0.002496 $5 -3.192777 -0.563682 0.074355 -5.163070 0.000000 -4.569714 $6 -0.463511 1.099182 1.285355 -1.143332 1.269214 0.000000
```

4 Step 3 - Calculate ratings from the normalised dominance degree values

```
[13]: delta_sums = np.zeros(m)
      for i in range(m):
         delta_sums[i] = sum(delta[i,:])
      pd.DataFrame(data=delta_sums,index=candidates,columns=['Sum'])
[13]:
               Sum
      S1 -1.487323
      S2 -11.953406
      S3 -16.358030
      S4 5.061361
      S5 -13.414887
          2.046908
[14]: delta_min = min(delta_sums)
      delta_max = max(delta_sums)
      pd.DataFrame(data=[delta_min, delta_max], columns=['Value'], index=['Minimum', __
       [14]:
                  Value
      Minimum -16.358030
     Maximum
               5.061361
[15]: ratings = (delta_sums - delta_min) / (delta_max - delta_min)
      pd.DataFrame(data=ratings, index=candidates, columns=['Rating'])
[15]:
           Rating
      S1
         0.694264
      S2 0.205637
      S3 0.000000
      S4 1.000000
      S5 0.137406
      S6 0.859265
```

5 Step 4 - Create rankings based on calculated ξ_i values

```
[16]: def rank_according_to(data):
    ranks = (rankdata(data) - 1).astype(int)
    storage = np.zeros_like(candidates)
    storage[ranks] = candidates
```

```
return storage[::-1]
[17]: result = rank_according_to(ratings)
      pd.DataFrame(data=result, index=range(1, m + 1), columns=['Name'])
[17]:
       Name
          S4
      1
      2
          S6
      3
         S1
      4
         S2
      5
         S5
      6
         S3
[18]: print("The best candidate/alternative according to C* is " + str(result[0]))
      print("The preferences in descending order are " + ", ".join(str(r) for r in ⊔
       →result) + ".")
```

The best candidate/alternative according to C* is S4
The preferences in descending order are S4, S6, S1, S2, S5, S3.