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1 Clustering Assignment

There will be some functions that start with the word "grader" ex: grader_actors(), grader_movies(), grader_cost1() etc, you should not change those function definition. Every Grader function has to return True.

Please check clustering assignment helper functions notebook before attempting this assignment.

- Read graph from the given movie_actor_network.csv (note that the graph is bipartite graph.)
- Using stellergaph and gensim packages, get the dense representation (128 dimensional vector) of every node in the graph. [Refer Clustering_Assignment_Reference.ipynb]
- Split the dense representation into actor nodes, movies nodes.(Write you code in def data_split())

2 Task 1: Apply clustering algorithm to group similar actors

- 1. For this task consider only the actor nodes
- 2. Apply any clustering algorithm of your choice Refer : https://scikit-learn.org/stable/modules/clustering.html
- 3. Choose the number of clusters for which you have maximum score of Cost1*Cost2
- 4. Cost1 = $\frac{1}{N} \sum_{\text{each cluster i}} \frac{\text{(number of nodes in the largest connected component in the graph with the actor nodes and its movie neimber of nodes in that cluster i)}{\text{(total number of nodes in that cluster i)}}$ where N= number of clusters (Write your code in def cost1())
- where N= number of clusters (Write your code in def cost1())

 5. Cost2 = $\frac{1}{N} \sum_{\text{each cluster i}} \frac{\text{(sum of degress of actor nodes in the graph with the actor nodes and its movie neighbours in cluster i)}{\text{(number of unique movie nodes in the graph with the actor nodes and its movie neighbours in cluster i)}}

 where N= number of clusters (Write your code in def cost2())$
- 6. Fit the clustering algorithm with the opimal number_of_clusters and get the cluster number for each node
- 7. Convert the d-dimensional dense vectors of nodes into 2-dimensional using dimensionality reduction techniques (preferably TSNE)
- 8. Plot the 2d scatter plot, with the node vectors after step e and give colors to nodes such that same cluster nodes will have same color

3 Task 2: Apply clustering algorithm to group similar movies

1. For this task consider only the movie nodes

2. Apply any clustering algorithm of your choice 3. Choose the number of clusters for which you have maximum score of Cost1 * Cost2

```
\underline{\text{(number of nodes in the largest connected component in the graph with the movie nodes and its actor <math>\text{neig}
\text{Cost1} = \frac{1}{N} \sum_{\text{each cluster i}}
                                                                                    (total number of nodes in that cluster i)
where N= number of clusters (Write your code in def cost1())
```

3. $\text{Cost2} = \frac{1}{N} \sum_{\text{each cluster i}} \frac{\text{(sum of degress of movie nodes in the graph with the movie nodes and its actor neighbours in cluster i)}{\text{(number of unique actor nodes in the graph with the movie nodes and its actor neighbours in cluster i)}}$ where N= number of clusters (Write your code in def cost2())

Algorithm for actor nodes

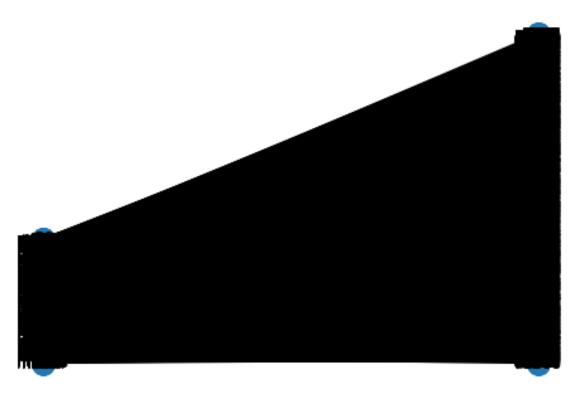
[8]: 1, r = nx.bipartite.sets(A)

 $pos = \{\}$

```
[59]: import networkx as nx
      from networkx.algorithms import bipartite
      import matplotlib.pyplot as plt
      from sklearn.cluster import KMeans
      import numpy as np
      import warnings
      warnings.filterwarnings("ignore")
      import pandas as pd
      # you need to have tensorflow
      from stellargraph.data import UniformRandomMetaPathWalk
      from stellargraph import StellarGraph
      from sklearn.manifold import TSNE
 [3]: data=pd.read csv('movie actor network.csv', index col=False,
       →names=['movie', 'actor'])
 [4]: edges = [tuple(x) for x in data.values.tolist()]
 [5]: B = nx.Graph()
      B.add_nodes_from(data['movie'].unique(), bipartite=0, label='movie')
      B.add_nodes_from(data['actor'].unique(), bipartite=1, label='actor')
      B.add_edges_from(edges, label='acted')
 [6]: # A = list(nx.connected_component_subgraphs(B))[0]
      A = [B.subgraph(element) for element in nx.connected_components(B)][0]
 [7]: print("number of nodes", A.number_of_nodes())
      print("number of edges", A.number_of_edges())
     number of nodes 4703
     number of edges 9650
```

pos.update((node, (1, index)) for index, node in enumerate(1)) pos.update((node, (2, index)) for index, node in enumerate(r))

```
nx.draw(A, pos=pos, with_labels=True)
plt.show()
```



```
[9]: movies = []
  actors = []
  for i in A.nodes():
    if 'm' in i:
       movies.append(i)
    if 'a' in i:
       actors.append(i)
  print('number of movies ', len(movies))
  print('number of actors ', len(actors))
number of movies 1292
number of actors 3411
```

Number of random walks: 4703

```
[11]: from gensim.models import Word2Vec
model = Word2Vec(walks, size=128, window=5)
```

- [12]: model.wv.vectors.shape # 128-dimensional vector for each node in the graph
- [12]: (4703, 128)
- [13]: # Retrieve node embeddings and corresponding subjects
 node_ids = model.wv.index2word # list of node IDs
 node_embeddings = model.wv.vectors # numpy.ndarray of size number of nodes

 → times embeddings dimensionality
 node_targets = [A.nodes[node_id]['label'] for node_id in node_ids]

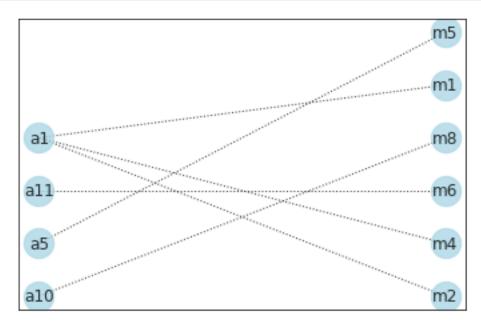
```
[22]: def data_split(node_ids,node_targets,node_embeddings):
           '''In \ this \ function, we will split the node embeddings into_\sqcup
       ⇒actor_embeddings , movie_embeddings '''
          actor_nodes,movie_nodes=[],[]
          actor embeddings,movie embeddings=[],[]
           # split the node_embeddings into actor_embeddings, movie_embeddings based on_
       \rightarrownode ids
          \# By using node_embedding and node_targets, we can extract actor_embedding_\sqcup
       \rightarrow and movie embedding
           # By using node_ids and node_targets, we can extract actor_nodes and movieu
       \rightarrow nodes
          for x,y,z in zip(node_ids, node_targets, node_embeddings):
               if y == 'actor':
                   actor_nodes.append(x)
                   actor_embeddings.append(z)
               else:
                   movie_nodes.append(x)
```

```
movie_embeddings.append(z)
           return actor_nodes,movie_nodes,actor_embeddings,movie_embeddings
[23]: actor_nodes,movie_nodes,actor_embeddings,movie_embeddings =__
       →data_split(node_ids,node_targets,node_embeddings)
     Grader function - 1
[24]: def grader actors(data):
           assert(len(data)==3411)
          return True
      grader_actors(actor_nodes)
[24]: True
     Grader function - 2
[25]: def grader_movies(data):
          assert(len(data)==1292)
          return True
      grader_movies(movie_nodes)
[25]: True
     Calculating cost1
                            (number of nodes in the largest connected component in the graph with the actor nodes and its movie neighbours
     \text{Cost1} = \frac{1}{N} \sum_{\text{each cluster i}}
                                                          (total number of nodes in that cluster i)
      where N= number of clusters
[36]: def cost1(graph,number_of_clusters):
           '''In this function, we will calculate cost1'''
          max_graph len = len(max(nx.connected_component_subgraphs(graph), key=len))
           cost1= (1/number_of_clusters) * max_graph_len / len(graph)
          return cost1
[38]: import networkx as nx
      from networkx.algorithms import bipartite
      graded_graph= nx.Graph()
      graded_graph.add_nodes_from(['a1','a5','a10','a11'], bipartite=0) # Add the__
       →node attribute "bipartite"
      graded_graph.add_nodes_from(['m1','m2','m4','m6','m5','m8'], bipartite=1)
      graded_graph.
       \rightarrow add_edges_from([('a1','m1'),('a1','m2'),('a1','m4'),('a11','m6'),('a5','m5'),('a10','m8')])
      l={'a1','a5','a10','a11'};r={'m1','m2','m4','m6','m5','m8'}
      pos = \{\}
      pos.update((node, (1, index)) for index, node in enumerate(1))
      pos.update((node, (2, index)) for index, node in enumerate(r))
```

```
nx.draw_networkx(graded_graph, pos=pos, 

→with_labels=True,node_color='lightblue',alpha=0.

→8,style='dotted',node_size=500)
```



Grader function - 3

```
[39]: graded_cost1=cost1(graded_graph,3)
def grader_cost1(data):
    assert(data==((1/3)*(4/10))) # 1/3 is number of clusters
    return True
grader_cost1(graded_cost1)
```

[39]: True

Calculating cost2

 $Cost2 = \frac{1}{N} \sum_{\text{each cluster i}} \frac{\text{(sum of degress of actor nodes in the graph with the actor nodes and its movie neighbours in cluster i)}{\text{(number of unique movie nodes in the graph with the actor nodes and its movie neighbours in cluster i)}}{\text{where N= number of clusters}}$

```
[52]: def cost2(graph,number_of_clusters):
    '''In this function, we will calculate cost1'''
    actor_degree = 0
    distinct_movies = 0
    for key, val in graded_graph.degree:

    if key[0] == 'a':
        actor_degree += val
        else:
```

```
distinct_movies += 1
cost2= (1/number_of_clusters) * (actor_degree/distinct_movies)
return cost2
```

Grader function - 4

```
[53]: graded_cost2=cost2(graded_graph,3)
  def grader_cost2(data):
         assert(data==((1/3)*(6/6))) # 1/3 is number of clusters
         return True
  grader_cost2(graded_cost2)
```

[53]: True

Grouping similar actors

```
[84]: clusters = list(range(2,101))
      final_metrics = []
      for k in clusters:
          number_of_clusters = k
          print('Clustering data into {} clusters'.format(k))
          kms = KMeans(n_clusters=number_of_clusters, random_state=42)
          kms.fit(actor embeddings)
          pred = kms.predict(actor_embeddings)
          # https://stackoverflow.com/questions/60935289/eqo-graph-in-networkx
          cost1 metric = 0
          cost2 metric = 0
          for ele in np.random.choice(actor_nodes, number_of_cluster):
                  temp_sub_graph = A.subgraph(ele)
                  cost1_metric += cost1(temp_sub_graph, number_of_clusters)
                  cost2_metric += cost2(temp_sub_graph, number_of_clusters)
          final_cost = cost1_metric * cost2_metric
          final_metrics.append(final_cost)
          print('Cost1 Metric Value',cost1_metric)
          print('Cost2 Metric Value',cost2_metric)
          print('Final Metric Value',final_cost)
```

Clustering data into 4 clusters

Cost1 Metric Value 1.0

Cost2 Metric Value 1.0

Final Metric Value 1.0

Clustering data into 5 clusters

Cost1 Metric Value 0.8

Cost2 Metric Value 0.8

Final Metric Value 0.640000000000001

Clustering data into 6 clusters

Clustering data into 7 clusters

Cost1 Metric Value 0.5714285714285714

Cost2 Metric Value 0.5714285714285714

Final Metric Value 0.32653061224489793

Clustering data into 8 clusters

Cost1 Metric Value 0.5

Cost2 Metric Value 0.5

Final Metric Value 0.25

Clustering data into 9 clusters

Final Metric Value 0.19753086419753085

Clustering data into 10 clusters

Cost1 Metric Value 0.4

Cost2 Metric Value 0.4

Final Metric Value 0.16000000000000003

Clustering data into 11 clusters

Cost1 Metric Value 0.36363636363636365

Cost2 Metric Value 0.36363636363636365

Final Metric Value 0.1322314049586777

Clustering data into 12 clusters

Cost2 Metric Value 0.33333333333333333

Final Metric Value 0.11111111111111111

Clustering data into 13 clusters

Cost1 Metric Value 0.3076923076923077

Cost2 Metric Value 0.3076923076923077

Final Metric Value 0.09467455621301776

Clustering data into 14 clusters

Cost1 Metric Value 0.2857142857142857

Cost2 Metric Value 0.2857142857142857

Final Metric Value 0.08163265306122448

Clustering data into 15 clusters

Clustering data into 16 clusters

Cost1 Metric Value 0.25

Cost2 Metric Value 0.25

Final Metric Value 0.0625

Clustering data into 17 clusters

Cost1 Metric Value 0.23529411764705882

Cost2 Metric Value 0.23529411764705882

Final Metric Value 0.05536332179930796

Clustering data into 18 clusters

Cost1 Metric Value 0.22222222222222

Cost2 Metric Value 0.22222222222222

Final Metric Value 0.04938271604938271

Clustering data into 19 clusters

Cost1 Metric Value 0.21052631578947367

Cost2 Metric Value 0.21052631578947367

Final Metric Value 0.04432132963988919

Clustering data into 20 clusters

Cost1 Metric Value 0.2

Cost2 Metric Value 0.2

Final Metric Value 0.0400000000000001

Clustering data into 21 clusters

Cost1 Metric Value 0.19047619047619047

Cost2 Metric Value 0.19047619047619047

Final Metric Value 0.03628117913832199

Clustering data into 22 clusters

Cost1 Metric Value 0.181818181818182

Cost2 Metric Value 0.181818181818182

Final Metric Value 0.03305785123966942

Clustering data into 23 clusters

Cost1 Metric Value 0.17391304347826086

Cost2 Metric Value 0.17391304347826086

Final Metric Value 0.030245746691871453

Clustering data into 24 clusters

Final Metric Value 0.027777777777776

Clustering data into 25 clusters

Cost1 Metric Value 0.16

Cost2 Metric Value 0.16

Final Metric Value 0.0256

Clustering data into 26 clusters

Cost1 Metric Value 0.15384615384615385

Cost2 Metric Value 0.15384615384615385

Final Metric Value 0.02366863905325444

Clustering data into 27 clusters

```
Cost2 Metric Value 0.14814814814814
```

Clustering data into 28 clusters

Cost1 Metric Value 0.14285714285714285

Cost2 Metric Value 0.14285714285714285

Final Metric Value 0.02040816326530612

Clustering data into 29 clusters

Cost1 Metric Value 0.13793103448275862

Cost2 Metric Value 0.13793103448275862

Final Metric Value 0.019024970273483946

Clustering data into 30 clusters

Final Metric Value 0.017777777777778

Clustering data into 31 clusters

Cost1 Metric Value 0.12903225806451613

Cost2 Metric Value 0.12903225806451613

Final Metric Value 0.016649323621227886

Clustering data into 32 clusters

Cost1 Metric Value 0.125

Cost2 Metric Value 0.125

Final Metric Value 0.015625

Clustering data into 33 clusters

Cost1 Metric Value 0.1212121212121222

Cost2 Metric Value 0.121212121212122

Final Metric Value 0.014692378328741967

Clustering data into 34 clusters

Cost1 Metric Value 0.11764705882352941

Cost2 Metric Value 0.11764705882352941

Final Metric Value 0.01384083044982699

Clustering data into 35 clusters

Cost1 Metric Value 0.11428571428571428

Cost2 Metric Value 0.11428571428571428

Final Metric Value 0.013061224489795917

Clustering data into 36 clusters

Cost1 Metric Value 0.11111111111111111

Cost2 Metric Value 0.11111111111111111

Final Metric Value 0.012345679012345678

Clustering data into 37 clusters

Cost1 Metric Value 0.10810810810810811

Cost2 Metric Value 0.10810810810810811

Final Metric Value 0.011687363038714392

Clustering data into 38 clusters

Cost1 Metric Value 0.10526315789473684

Cost2 Metric Value 0.10526315789473684

Final Metric Value 0.011080332409972297

Clustering data into 39 clusters

```
Cost2 Metric Value 0.10256410256410256
```

Clustering data into 40 clusters

Cost1 Metric Value 0.1

Cost2 Metric Value 0.1

Final Metric Value 0.010000000000000002

Clustering data into 41 clusters

Cost1 Metric Value 0.0975609756097561

Cost2 Metric Value 0.0975609756097561

Final Metric Value 0.009518143961927425

Clustering data into 42 clusters

Cost1 Metric Value 0.09523809523809523

Cost2 Metric Value 0.09523809523809523

Final Metric Value 0.009070294784580497

Clustering data into 43 clusters

Cost1 Metric Value 0.09302325581395349

Cost2 Metric Value 0.09302325581395349

Final Metric Value 0.00865332612222823

Clustering data into 44 clusters

Cost1 Metric Value 0.09090909090909091

Cost2 Metric Value 0.090909090909091

Final Metric Value 0.008264462809917356

Clustering data into 45 clusters

Cost2 Metric Value 0.08888888888888888

Final Metric Value 0.007901234567901235

Clustering data into 46 clusters

Cost1 Metric Value 0.08695652173913043

Cost2 Metric Value 0.08695652173913043

Final Metric Value 0.007561436672967863

Clustering data into 47 clusters

Cost1 Metric Value 0.0851063829787234

Cost2 Metric Value 0.0851063829787234

Final Metric Value 0.007243096423721141

Clustering data into 48 clusters

Cost1 Metric Value 0.083333333333333333

Final Metric Value 0.0069444444444444444

Clustering data into 49 clusters

Cost1 Metric Value 0.08163265306122448

Cost2 Metric Value 0.08163265306122448

Final Metric Value 0.006663890045814243

Clustering data into 50 clusters

Cost1 Metric Value 0.08

Cost2 Metric Value 0.08

Final Metric Value 0.0064

Clustering data into 51 clusters

```
Cost2 Metric Value 0.0784313725490196
```

Clustering data into 52 clusters

Cost1 Metric Value 0.07692307692307693

Cost2 Metric Value 0.07692307692307693

Final Metric Value 0.00591715976331361

Clustering data into 53 clusters

Cost1 Metric Value 0.07547169811320754

Cost2 Metric Value 0.07547169811320754

Final Metric Value 0.005695977216091135

Clustering data into 54 clusters

Cost1 Metric Value 0.07407407407407407

Cost2 Metric Value 0.07407407407407407

Final Metric Value 0.0054869684499314125

Clustering data into 55 clusters

Cost1 Metric Value 0.07272727272727272

Cost2 Metric Value 0.07272727272727272

Final Metric Value 0.005289256198347107

Clustering data into 56 clusters

Cost1 Metric Value 0.07142857142857142

Cost2 Metric Value 0.07142857142857142

Final Metric Value 0.00510204081632653

Clustering data into 57 clusters

Cost1 Metric Value 0.07017543859649122

Cost2 Metric Value 0.07017543859649122

Final Metric Value 0.0049245921822099106

Clustering data into 58 clusters

Cost1 Metric Value 0.06896551724137931

Cost2 Metric Value 0.06896551724137931

Final Metric Value 0.0047562425683709865

Clustering data into 59 clusters

Cost1 Metric Value 0.06779661016949153

Cost2 Metric Value 0.06779661016949153

Final Metric Value 0.004596380350474002

Clustering data into 60 clusters

Cost1 Metric Value 0.066666666666666667

Cost2 Metric Value 0.06666666666666667

Clustering data into 61 clusters

Cost1 Metric Value 0.06557377049180328

Cost2 Metric Value 0.06557377049180328

Final Metric Value 0.004299919376511691

Clustering data into 62 clusters

Cost1 Metric Value 0.06451612903225806

Cost2 Metric Value 0.06451612903225806

Final Metric Value 0.004162330905306971

Clustering data into 63 clusters

```
Cost2 Metric Value 0.06349206349206349
```

Clustering data into 64 clusters

Cost1 Metric Value 0.0625

Cost2 Metric Value 0.0625

Final Metric Value 0.00390625

Clustering data into 65 clusters

Cost1 Metric Value 0.06153846153846154

Cost2 Metric Value 0.06153846153846154

Final Metric Value 0.0037869822485207105

Clustering data into 66 clusters

Cost1 Metric Value 0.06060606060606061

Cost2 Metric Value 0.06060606060606061

Final Metric Value 0.0036730945821854917

Clustering data into 67 clusters

Cost1 Metric Value 0.05970149253731343

Cost2 Metric Value 0.05970149253731343

Final Metric Value 0.0035642682111828913

Clustering data into 68 clusters

Cost1 Metric Value 0.058823529411764705

Cost2 Metric Value 0.058823529411764705

Final Metric Value 0.0034602076124567475

Clustering data into 69 clusters

Cost1 Metric Value 0.057971014492753624

Cost2 Metric Value 0.057971014492753624

Final Metric Value 0.003360638521319051

Clustering data into 70 clusters

Cost1 Metric Value 0.05714285714285714

Cost2 Metric Value 0.05714285714285714

Final Metric Value 0.0032653061224489793

Clustering data into 71 clusters

Cost1 Metric Value 0.056338028169014086

Cost2 Metric Value 0.056338028169014086

Final Metric Value 0.0031739734179726245

Clustering data into 72 clusters

Cost1 Metric Value 0.055555555555555555

Cost2 Metric Value 0.055555555555555555

Final Metric Value 0.0030864197530864196

Clustering data into 73 clusters

Cost1 Metric Value 0.0547945205479452

Cost2 Metric Value 0.0547945205479452

Final Metric Value 0.003002439482079189

Clustering data into 74 clusters

Cost1 Metric Value 0.05405405405405406

Cost2 Metric Value 0.05405405405405406

Final Metric Value 0.002921840759678598

Clustering data into 75 clusters

```
Cost2 Metric Value 0.05333333333333333333
```

Clustering data into 76 clusters

Cost1 Metric Value 0.05263157894736842

Cost2 Metric Value 0.05263157894736842

Final Metric Value 0.0027700831024930744

Clustering data into 77 clusters

Cost1 Metric Value 0.05194805194805195

Cost2 Metric Value 0.05194805194805195

Final Metric Value 0.002698600101197504

Clustering data into 78 clusters

Cost1 Metric Value 0.05128205128205128

Cost2 Metric Value 0.05128205128205128

Final Metric Value 0.0026298487836949372

Clustering data into 79 clusters

Cost1 Metric Value 0.05063291139240506

Cost2 Metric Value 0.05063291139240506

Final Metric Value 0.0025636917160711424

Clustering data into 80 clusters

Cost1 Metric Value 0.05

Cost2 Metric Value 0.05

Final Metric Value 0.0025000000000000005

Clustering data into 81 clusters

Cost1 Metric Value 0.04938271604938271

Cost2 Metric Value 0.04938271604938271

Final Metric Value 0.002438652644413961

Clustering data into 82 clusters

Cost1 Metric Value 0.04878048780487805

Cost2 Metric Value 0.04878048780487805

Final Metric Value 0.002379535990481856

Clustering data into 83 clusters

Cost1 Metric Value 0.04819277108433735

Cost2 Metric Value 0.04819277108433735

Final Metric Value 0.0023225431847873424

Clustering data into 84 clusters

Cost1 Metric Value 0.047619047619047616

Cost2 Metric Value 0.047619047619047616

Final Metric Value 0.0022675736961451243

Clustering data into 85 clusters

Cost1 Metric Value 0.047058823529411764

Cost2 Metric Value 0.047058823529411764

Final Metric Value 0.002214532871972318

Clustering data into 86 clusters

Cost1 Metric Value 0.046511627906976744

Cost2 Metric Value 0.046511627906976744

Final Metric Value 0.0021633315305570576

Clustering data into 87 clusters

```
Cost2 Metric Value 0.04597701149425287
```

Clustering data into 88 clusters

Cost1 Metric Value 0.045454545454545456

Cost2 Metric Value 0.045454545454545456

Final Metric Value 0.002066115702479339

Clustering data into 89 clusters

Cost1 Metric Value 0.0449438202247191

Cost2 Metric Value 0.0449438202247191

Final Metric Value 0.0020199469763918696

Clustering data into 90 clusters

Cost1 Metric Value 0.0444444444444446

Cost2 Metric Value 0.0444444444444446

Final Metric Value 0.0019753086419753087

Clustering data into 91 clusters

Cost1 Metric Value 0.04395604395604396

Cost2 Metric Value 0.04395604395604396

Final Metric Value 0.0019321338002656688

Clustering data into 92 clusters

Cost1 Metric Value 0.043478260869565216

Cost2 Metric Value 0.043478260869565216

Final Metric Value 0.0018903591682419658

Clustering data into 93 clusters

Cost1 Metric Value 0.043010752688172046

Cost2 Metric Value 0.043010752688172046

Final Metric Value 0.001849924846803099

Clustering data into 94 clusters

Cost1 Metric Value 0.0425531914893617

Cost2 Metric Value 0.0425531914893617

Final Metric Value 0.0018107741059302852

Clustering data into 95 clusters

Cost1 Metric Value 0.042105263157894736

Cost2 Metric Value 0.042105263157894736

Final Metric Value 0.0017728531855955678

Clustering data into 96 clusters

Cost1 Metric Value 0.041666666666666664

Cost2 Metric Value 0.041666666666666664

Final Metric Value 0.001736111111111111

Clustering data into 97 clusters

Cost1 Metric Value 0.041237113402061855

Cost2 Metric Value 0.041237113402061855

Final Metric Value 0.0017004995217345094

Clustering data into 98 clusters

Cost1 Metric Value 0.04081632653061224

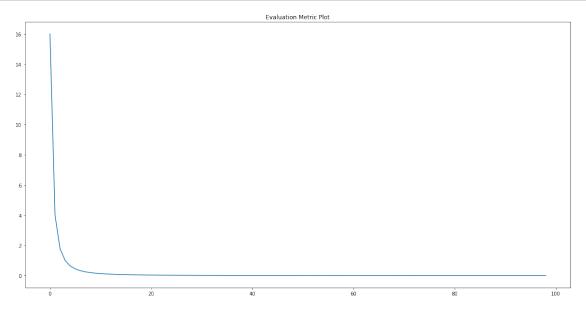
Cost2 Metric Value 0.04081632653061224

Final Metric Value 0.0016659725114535606

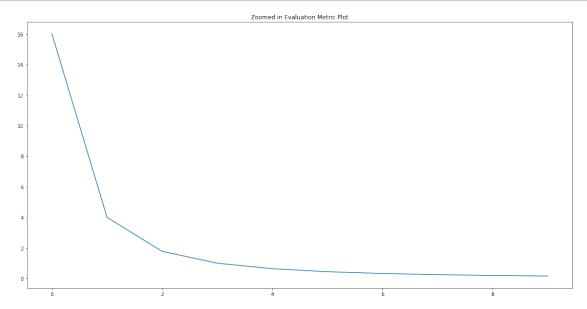
Clustering data into 99 clusters

Cost2 Metric Value 0.04040404040404041 Final Metric Value 0.0016324864809713297

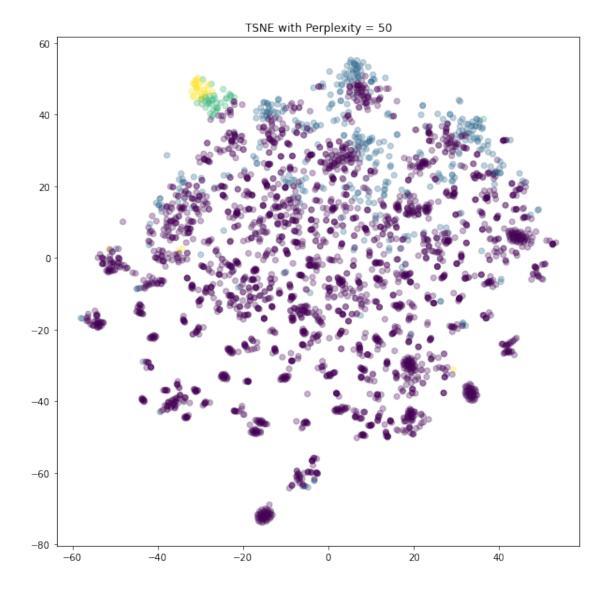
```
[97]: __, ax = plt.subplots(1,1, figsize=(20, 10))
ax.plot(final_metrics)
ax.set_title('Evaluation Metric Plot')
plt.show()
```

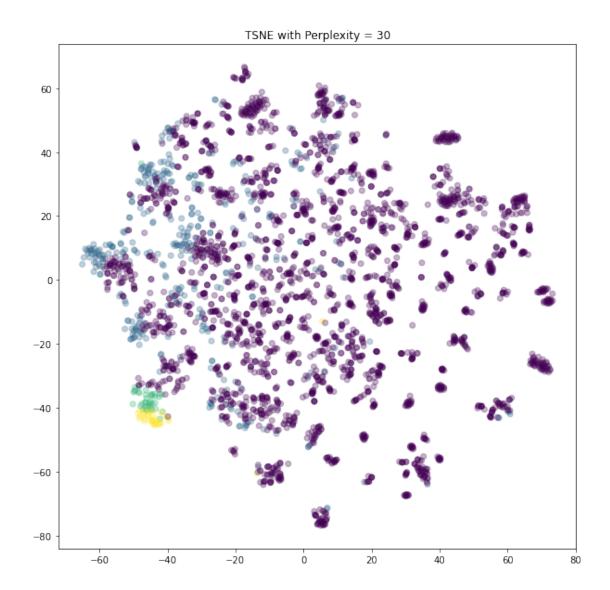


```
[96]: _, ax = plt.subplots(1,1, figsize=(20, 10))
    ax.plot(final_metrics[:10])
    ax.set_title('Zoomed in Evaluation Metric Plot')
    plt.show()
```



```
[120]: number_of_clusters = 4
       print('Clustering data into {} clusters'.format(number_of_clusters))
       kms = KMeans(n_clusters=number_of_clusters, random_state=42)
       kms.fit(actor_embeddings)
       pred = kms.predict(actor_embeddings)
       # https://stackoverflow.com/questions/60935289/ego-graph-in-networkx
       cost1 metric = 0
       cost2 metric = 0
       for ele in np.random.choice(actor nodes, number of cluster):
               temp sub graph = A.subgraph(ele)
               cost1_metric += cost1(temp_sub_graph, number_of_clusters)
               cost2_metric += cost2(temp_sub_graph, number_of_clusters)
       final_cost = cost1_metric * cost2_metric
       print('Cost1 Metric Value',cost1_metric)
       print('Cost2 Metric Value',cost2_metric)
       print('Final Metric Value',final_cost)
      Clustering data into 4 clusters
      Cost1 Metric Value 1.0
      Cost2 Metric Value 1.0
      Final Metric Value 1.0
      Displaying similar actor clusters
[121]: tsne = TSNE(n_components=2, perplexity=50)
       actor_2d_transformation = tsne.fit_transform(actor_embeddings)
       _, ax = plt.subplots(1, 1, figsize=(10, 10))
       ax.scatter(actor_2d_transformation[:, 0], actor_2d_transformation[:, 1],
                 c = pred, alpha=0.3)
       ax.set_title('TSNE with Perplexity = 50')
       plt.show()
       tsne = TSNE(n_components=2, perplexity=30)
       actor 2d transformation = tsne.fit transform(actor embeddings)
       _, ax = plt.subplots(1, 1, figsize=(10, 10))
       ax.scatter(actor_2d_transformation[:, 0], actor_2d_transformation[:, 1],
                 c = pred, alpha=0.3)
       ax.set_title('TSNE with Perplexity = 30')
       plt.show()
```





Grouping similar movies

```
clusters = list(range(2,101))
final_metrics = []
for k in clusters:
    number_of_clusters = k
    print('Clustering data into {} clusters'.format(k))
    kms = KMeans(n_clusters=number_of_clusters, random_state=42)
    kms.fit(actor_embeddings)
    pred = kms.predict(movie_embeddings)
    cost1_metric = 0
    cost2_metric = 0
    for ele in np.random.choice(actor_nodes, number_of_cluster):
        temp_sub_graph = A.subgraph(ele)
```

```
Clustering data into 2 clusters
Cost1 Metric Value 2.0
Cost2 Metric Value 2.0
Final Metric Value 4.0
Clustering data into 3 clusters
Cost1 Metric Value 1.33333333333333333
Final Metric Value 1.777777777777777
Clustering data into 4 clusters
Cost1 Metric Value 1.0
Cost2 Metric Value 1.0
Final Metric Value 1.0
Clustering data into 5 clusters
Cost1 Metric Value 0.8
Cost2 Metric Value 0.8
Final Metric Value 0.640000000000001
Clustering data into 6 clusters
Clustering data into 7 clusters
Cost1 Metric Value 0.5714285714285714
Cost2 Metric Value 0.5714285714285714
Final Metric Value 0.32653061224489793
Clustering data into 8 clusters
Cost1 Metric Value 0.5
Cost2 Metric Value 0.5
Final Metric Value 0.25
Clustering data into 9 clusters
Final Metric Value 0.19753086419753085
Clustering data into 10 clusters
Cost1 Metric Value 0.4
Cost2 Metric Value 0.4
Final Metric Value 0.16000000000000003
Clustering data into 11 clusters
Cost1 Metric Value 0.36363636363636365
Cost2 Metric Value 0.36363636363636365
```

```
Final Metric Value 0.1322314049586777
Clustering data into 12 clusters
Final Metric Value 0.11111111111111111
Clustering data into 13 clusters
Cost1 Metric Value 0.3076923076923077
Cost2 Metric Value 0.3076923076923077
Final Metric Value 0.09467455621301776
Clustering data into 14 clusters
Cost1 Metric Value 0.2857142857142857
Cost2 Metric Value 0.2857142857142857
Final Metric Value 0.08163265306122448
Clustering data into 15 clusters
Final Metric Value 0.07111111111111111
Clustering data into 16 clusters
Cost1 Metric Value 0.25
Cost2 Metric Value 0.25
Final Metric Value 0.0625
Clustering data into 17 clusters
Cost1 Metric Value 0.23529411764705882
Cost2 Metric Value 0.23529411764705882
Final Metric Value 0.05536332179930796
Clustering data into 18 clusters
Cost1 Metric Value 0.22222222222222
Cost2 Metric Value 0.22222222222222
Final Metric Value 0.04938271604938271
Clustering data into 19 clusters
Cost1 Metric Value 0.21052631578947367
Cost2 Metric Value 0.21052631578947367
Final Metric Value 0.04432132963988919
Clustering data into 20 clusters
Cost1 Metric Value 0.2
Cost2 Metric Value 0.2
Final Metric Value 0.04000000000000001
Clustering data into 21 clusters
Cost1 Metric Value 0.19047619047619047
Cost2 Metric Value 0.19047619047619047
Final Metric Value 0.03628117913832199
Clustering data into 22 clusters
Cost1 Metric Value 0.181818181818182
```

Cost2 Metric Value 0.18181818181818182 Final Metric Value 0.03305785123966942

Cost1 Metric Value 0.17391304347826086 Cost2 Metric Value 0.17391304347826086

Clustering data into 23 clusters

```
Final Metric Value 0.030245746691871453
```

Clustering data into 24 clusters

Final Metric Value 0.027777777777776

Clustering data into 25 clusters

Cost1 Metric Value 0.16

Cost2 Metric Value 0.16

Final Metric Value 0.0256

Clustering data into 26 clusters

Cost1 Metric Value 0.15384615384615385

Cost2 Metric Value 0.15384615384615385

Final Metric Value 0.02366863905325444

Clustering data into 27 clusters

Cost1 Metric Value 0.14814814814814814

Cost2 Metric Value 0.14814814814814814

Final Metric Value 0.02194787379972565

Clustering data into 28 clusters

Cost1 Metric Value 0.14285714285714285

Cost2 Metric Value 0.14285714285714285

Final Metric Value 0.02040816326530612

Clustering data into 29 clusters

Cost1 Metric Value 0.13793103448275862

Cost2 Metric Value 0.13793103448275862

Final Metric Value 0.019024970273483946

Clustering data into 30 clusters

Cost1 Metric Value 0.133333333333333333

Final Metric Value 0.017777777777778

Clustering data into 31 clusters

Cost1 Metric Value 0.12903225806451613

Cost2 Metric Value 0.12903225806451613

Final Metric Value 0.016649323621227886

Clustering data into 32 clusters

Cost1 Metric Value 0.125

Cost2 Metric Value 0.125

Final Metric Value 0.015625

Clustering data into 33 clusters

Cost1 Metric Value 0.1212121212121222

Cost2 Metric Value 0.1212121212121222

Final Metric Value 0.014692378328741967

Clustering data into 34 clusters

Cost1 Metric Value 0.11764705882352941

Cost2 Metric Value 0.11764705882352941

Final Metric Value 0.01384083044982699

Clustering data into 35 clusters

Cost1 Metric Value 0.11428571428571428

```
Final Metric Value 0.013061224489795917
```

Clustering data into 36 clusters

Cost1 Metric Value 0.11111111111111111

Cost2 Metric Value 0.1111111111111111

Final Metric Value 0.012345679012345678

Clustering data into 37 clusters

Cost1 Metric Value 0.10810810810810811

Cost2 Metric Value 0.10810810810810811

Final Metric Value 0.011687363038714392

Clustering data into 38 clusters

Cost1 Metric Value 0.10526315789473684

Cost2 Metric Value 0.10526315789473684

Final Metric Value 0.011080332409972297

Clustering data into 39 clusters

Cost1 Metric Value 0.10256410256410256

Cost2 Metric Value 0.10256410256410256

Final Metric Value 0.010519395134779749

Clustering data into 40 clusters

Cost1 Metric Value 0.1

Cost2 Metric Value 0.1

Final Metric Value 0.010000000000000002

Clustering data into 41 clusters

Cost1 Metric Value 0.0975609756097561

Cost2 Metric Value 0.0975609756097561

Final Metric Value 0.009518143961927425

Clustering data into 42 clusters

Cost1 Metric Value 0.09523809523809523

Cost2 Metric Value 0.09523809523809523

Final Metric Value 0.009070294784580497

Clustering data into 43 clusters

Cost1 Metric Value 0.09302325581395349

Cost2 Metric Value 0.09302325581395349

Final Metric Value 0.00865332612222823

Clustering data into 44 clusters

Cost1 Metric Value 0.090909090909091

Cost2 Metric Value 0.09090909090909091

Final Metric Value 0.008264462809917356

Clustering data into 45 clusters

Cost1 Metric Value 0.08888888888888888

Final Metric Value 0.007901234567901235

Clustering data into 46 clusters

Cost1 Metric Value 0.08695652173913043

Cost2 Metric Value 0.08695652173913043

Final Metric Value 0.007561436672967863

Clustering data into 47 clusters

Cost1 Metric Value 0.0851063829787234

```
Final Metric Value 0.007243096423721141
```

Clustering data into 48 clusters

Final Metric Value 0.0069444444444444444

Clustering data into 49 clusters

Cost1 Metric Value 0.08163265306122448

Cost2 Metric Value 0.08163265306122448

Final Metric Value 0.006663890045814243

Clustering data into 50 clusters

Cost1 Metric Value 0.08

Cost2 Metric Value 0.08

Final Metric Value 0.0064

Clustering data into 51 clusters

Cost1 Metric Value 0.0784313725490196

Cost2 Metric Value 0.0784313725490196

Final Metric Value 0.006151480199923107

Clustering data into 52 clusters

Cost1 Metric Value 0.07692307692307693

Cost2 Metric Value 0.07692307692307693

Final Metric Value 0.00591715976331361

Clustering data into 53 clusters

Cost1 Metric Value 0.07547169811320754

Cost2 Metric Value 0.07547169811320754

Final Metric Value 0.005695977216091135

Clustering data into 54 clusters

Cost1 Metric Value 0.07407407407407407

Cost2 Metric Value 0.07407407407407407

Final Metric Value 0.0054869684499314125

Clustering data into 55 clusters

Cost1 Metric Value 0.07272727272727272

Cost2 Metric Value 0.07272727272727272

Final Metric Value 0.005289256198347107

Clustering data into 56 clusters

Cost1 Metric Value 0.07142857142857142

Cost2 Metric Value 0.07142857142857142

Final Metric Value 0.00510204081632653

Clustering data into 57 clusters

Cost1 Metric Value 0.07017543859649122

Cost2 Metric Value 0.07017543859649122

Final Metric Value 0.0049245921822099106

Clustering data into 58 clusters

Cost1 Metric Value 0.06896551724137931

Cost2 Metric Value 0.06896551724137931

Final Metric Value 0.0047562425683709865

Clustering data into 59 clusters

Cost1 Metric Value 0.06779661016949153

```
Final Metric Value 0.004596380350474002
```

Clustering data into 60 clusters

Cost1 Metric Value 0.066666666666666667

Cost2 Metric Value 0.066666666666666667

Clustering data into 61 clusters

Cost1 Metric Value 0.06557377049180328

Cost2 Metric Value 0.06557377049180328

Final Metric Value 0.004299919376511691

Clustering data into 62 clusters

Cost1 Metric Value 0.06451612903225806

Cost2 Metric Value 0.06451612903225806

Final Metric Value 0.004162330905306971

Clustering data into 63 clusters

Cost1 Metric Value 0.06349206349206349

Cost2 Metric Value 0.06349206349206349

Final Metric Value 0.004031242126480221

Clustering data into 64 clusters

Cost1 Metric Value 0.0625

Cost2 Metric Value 0.0625

Final Metric Value 0.00390625

Clustering data into 65 clusters

Cost1 Metric Value 0.06153846153846154

Cost2 Metric Value 0.06153846153846154

Final Metric Value 0.0037869822485207105

Clustering data into 66 clusters

Cost1 Metric Value 0.06060606060606061

Cost2 Metric Value 0.06060606060606061

Final Metric Value 0.0036730945821854917

Clustering data into 67 clusters

Cost1 Metric Value 0.05970149253731343

Cost2 Metric Value 0.05970149253731343

Final Metric Value 0.0035642682111828913

Clustering data into 68 clusters

Cost1 Metric Value 0.058823529411764705

Cost2 Metric Value 0.058823529411764705

Final Metric Value 0.0034602076124567475

Clustering data into 69 clusters

Cost1 Metric Value 0.057971014492753624

Cost2 Metric Value 0.057971014492753624

Final Metric Value 0.003360638521319051

Clustering data into 70 clusters

Cost1 Metric Value 0.05714285714285714

Cost2 Metric Value 0.05714285714285714

Final Metric Value 0.0032653061224489793

Clustering data into 71 clusters

Cost1 Metric Value 0.056338028169014086

```
Final Metric Value 0.0031739734179726245
```

Clustering data into 72 clusters

Cost1 Metric Value 0.05555555555555555

Cost2 Metric Value 0.055555555555555555

Final Metric Value 0.0030864197530864196

Clustering data into 73 clusters

Cost1 Metric Value 0.0547945205479452

Cost2 Metric Value 0.0547945205479452

Final Metric Value 0.003002439482079189

Clustering data into 74 clusters

Cost1 Metric Value 0.05405405405405406

Cost2 Metric Value 0.05405405405405406

Final Metric Value 0.002921840759678598

Clustering data into 75 clusters

Cost1 Metric Value 0.0533333333333333333

Cost2 Metric Value 0.0533333333333333333

Final Metric Value 0.00284444444444445

Clustering data into 76 clusters

Cost1 Metric Value 0.05263157894736842

Cost2 Metric Value 0.05263157894736842

Final Metric Value 0.0027700831024930744

Clustering data into 77 clusters

Cost1 Metric Value 0.05194805194805195

Cost2 Metric Value 0.05194805194805195

Final Metric Value 0.002698600101197504

Clustering data into 78 clusters

Cost1 Metric Value 0.05128205128205128

Cost2 Metric Value 0.05128205128205128

Final Metric Value 0.0026298487836949372

Clustering data into 79 clusters

Cost1 Metric Value 0.05063291139240506

Cost2 Metric Value 0.05063291139240506

Final Metric Value 0.0025636917160711424

Clustering data into 80 clusters

Cost1 Metric Value 0.05

Cost2 Metric Value 0.05

Final Metric Value 0.002500000000000005

Clustering data into 81 clusters

Cost1 Metric Value 0.04938271604938271

Cost2 Metric Value 0.04938271604938271

Final Metric Value 0.002438652644413961

Clustering data into 82 clusters

Cost1 Metric Value 0.04878048780487805

Cost2 Metric Value 0.04878048780487805

Final Metric Value 0.002379535990481856

Clustering data into 83 clusters

Cost1 Metric Value 0.04819277108433735

```
Final Metric Value 0.0023225431847873424
```

Clustering data into 84 clusters

Cost1 Metric Value 0.047619047619047616

Cost2 Metric Value 0.047619047619047616

Final Metric Value 0.0022675736961451243

Clustering data into 85 clusters

Cost1 Metric Value 0.047058823529411764

Cost2 Metric Value 0.047058823529411764

Final Metric Value 0.002214532871972318

Clustering data into 86 clusters

Cost1 Metric Value 0.046511627906976744

Cost2 Metric Value 0.046511627906976744

Final Metric Value 0.0021633315305570576

Clustering data into 87 clusters

Cost1 Metric Value 0.04597701149425287

Cost2 Metric Value 0.04597701149425287

Final Metric Value 0.002113885585942661

Clustering data into 88 clusters

Cost1 Metric Value 0.045454545454545456

Cost2 Metric Value 0.045454545454545456

Final Metric Value 0.002066115702479339

Clustering data into 89 clusters

Cost1 Metric Value 0.0449438202247191

Cost2 Metric Value 0.0449438202247191

Final Metric Value 0.0020199469763918696

Clustering data into 90 clusters

Cost1 Metric Value 0.0444444444444446

Cost2 Metric Value 0.0444444444444446

Final Metric Value 0.0019753086419753087

Clustering data into 91 clusters

Cost1 Metric Value 0.04395604395604396

Cost2 Metric Value 0.04395604395604396

Final Metric Value 0.0019321338002656688

Clustering data into 92 clusters

Cost1 Metric Value 0.043478260869565216

Cost2 Metric Value 0.043478260869565216

Final Metric Value 0.0018903591682419658

Clustering data into 93 clusters

Cost1 Metric Value 0.043010752688172046

Cost2 Metric Value 0.043010752688172046

Final Metric Value 0.001849924846803099

Clustering data into 94 clusters

Cost1 Metric Value 0.0425531914893617

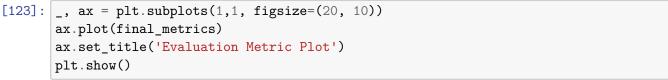
Cost2 Metric Value 0.0425531914893617

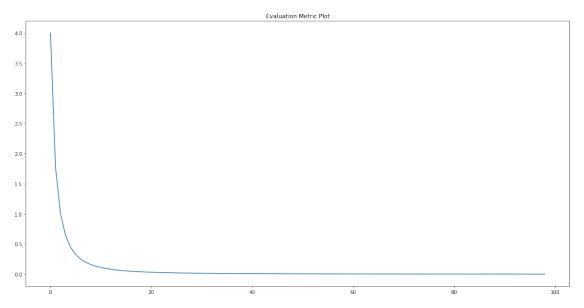
Final Metric Value 0.0018107741059302852

Clustering data into 95 clusters

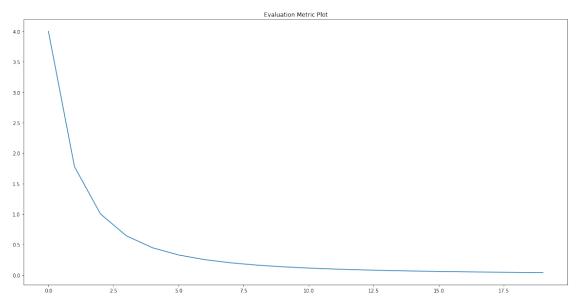
Cost1 Metric Value 0.042105263157894736

```
Final Metric Value 0.0017728531855955678
Clustering data into 96 clusters
Cost1 Metric Value 0.041666666666666666
Cost2 Metric Value 0.041666666666666664
Final Metric Value 0.001736111111111111
Clustering data into 97 clusters
Cost1 Metric Value 0.041237113402061855
Cost2 Metric Value 0.041237113402061855
Final Metric Value 0.0017004995217345094
Clustering data into 98 clusters
Cost1 Metric Value 0.04081632653061224
Cost2 Metric Value 0.04081632653061224
Final Metric Value 0.0016659725114535606
Clustering data into 99 clusters
Cost1 Metric Value 0.040404040404041
Cost2 Metric Value 0.04040404040404041
Final Metric Value 0.0016324864809713297
Clustering data into 100 clusters
Cost1 Metric Value 0.04
Cost2 Metric Value 0.04
Final Metric Value 0.0016
```





```
[124]: _, ax = plt.subplots(1,1, figsize=(20, 10))
ax.plot(final_metrics[:20])
ax.set_title('Evaluation Metric Plot')
plt.show()
```



Displaying similar movie clusters

```
[130]: number_of_clusters = 4
       print('Clustering data into {} clusters'.format(number_of_clusters))
       kms = KMeans(n_clusters=number_of_clusters, random_state=42)
       kms.fit(movie_embeddings)
       pred = kms.predict(movie_embeddings)
       # https://stackoverflow.com/questions/60935289/eqo-graph-in-networkx
       cost1_metric = 0
       cost2_metric = 0
       for ele in np.random.choice(movie_nodes, number_of_cluster):
               temp_sub_graph = A.subgraph(ele)
               cost1_metric += cost1(temp_sub_graph, number_of_clusters)
               cost2_metric += cost2(temp_sub_graph, number_of_clusters)
       final_cost = cost1_metric * cost2_metric
       print('Cost1 Metric Value',cost1_metric)
       print('Cost2 Metric Value',cost2_metric)
       print('Final Metric Value',final_cost)
```

```
Clustering data into 4 clusters
Cost1 Metric Value 1.0
Cost2 Metric Value 1.0
Final Metric Value 1.0
```

