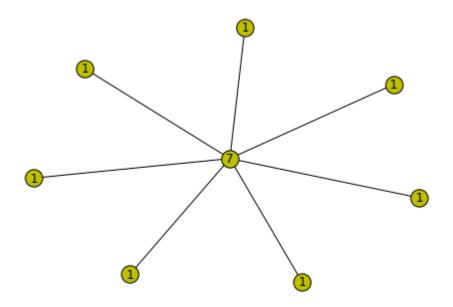
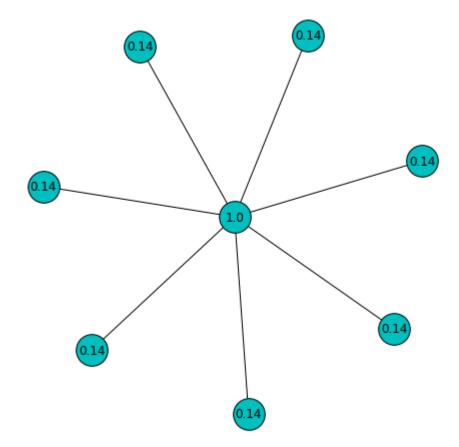
14. Centrality

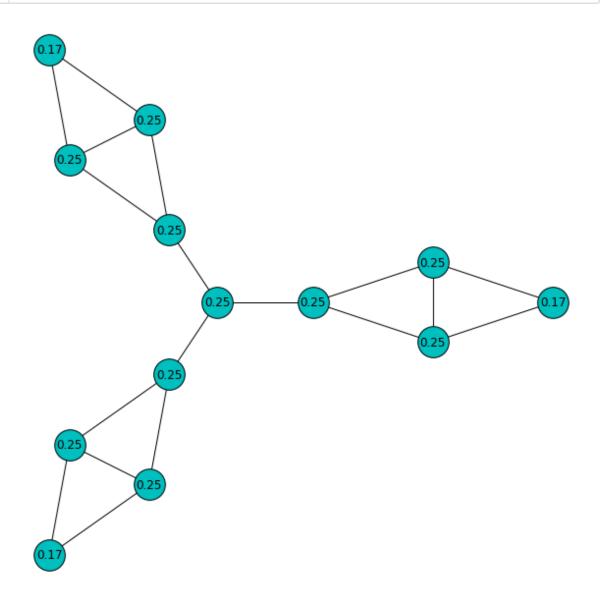
```
In [1]:
             %matplotlib inline
          2
             import networkx as nx
            import matplotlib.pylab as plt
             import numpy as np
             import netlab as nl
          7
             def my_draw(G, pos=None, ncolor='r', nsize=300, nlabels=None, elabels=None):
          8
                 if pos == None:
          9
                     pos = nx.spring layout(G)
         10
         11
                 if type(nlabels) is str:
         12
                     if nlabels=='id':
         13
                         nlabels = dict(zip(G.nodes(), G.nodes()))
         14
                     else:
                          nlabels = nx.get node attributes(G, nlabels)
         15
         16
         17
                 nx.draw_networkx(G, pos=pos, labels=nlabels, node_color=ncolor, node_siz
                  nx.draw networkx edges(G, pos=pos, node color=ncolor, node size=nsize)
         18
         19
         20
                 if elabels != None:
         21
                     nx.draw networkx edge labels(G, pos=pos, edge labels=elabels)
         22
                 return
         23
             def roffdict(X, dec=2):
         24
         25
                 C = map(lambda \ a:round(X[a],dec), X)
         26
                 return dict(zip(X.keys(), C))
         27
         28
             def roff(X, dec=2):
         29
                 return map(lambda a: round(a, dec), X)
```

Degree Centrality

```
In [2]: 1   G = nx.read_gml('Graphs/C01.gml')
2   nl.draw_atlas(G, node_color='y', labels=dict(G.degree()))
```

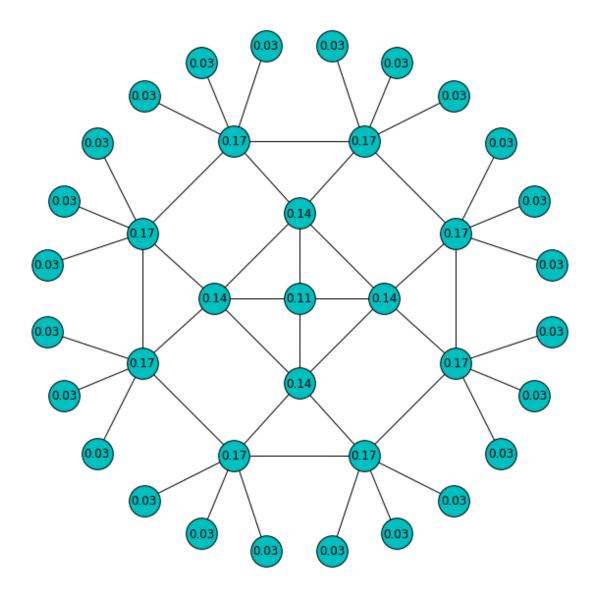


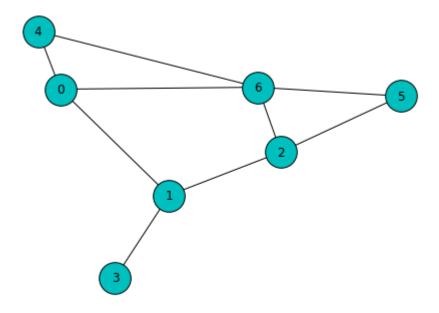


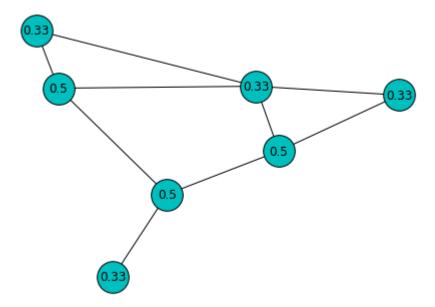


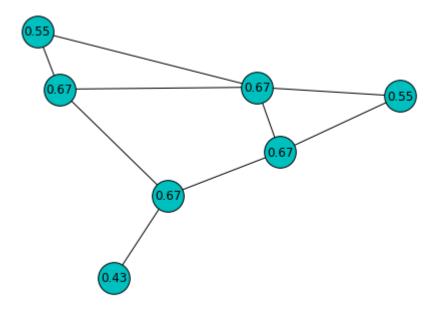
Pitfall of the degree centrality

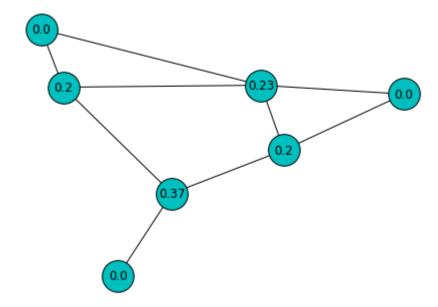
```
In [6]: 1    G = nx.read_gml('Graphs/C02.gml')
2    deg = nx.degree_centrality(G)
3    layout = nl.absolute_layout(G, 'px', 'py')
4    plt.figure(1,figsize=(8,8))
5    nl.draw_atlas(G, node_color='c', node_size=1000, pos=layout, labels=roffdict
```

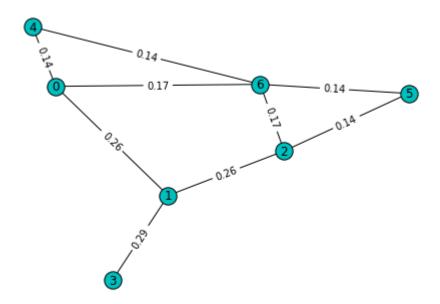


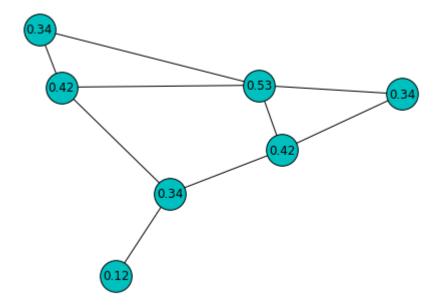






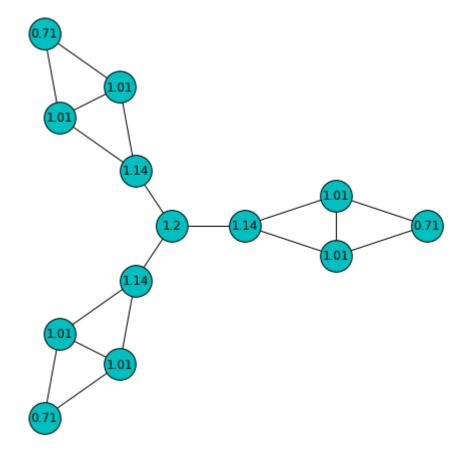


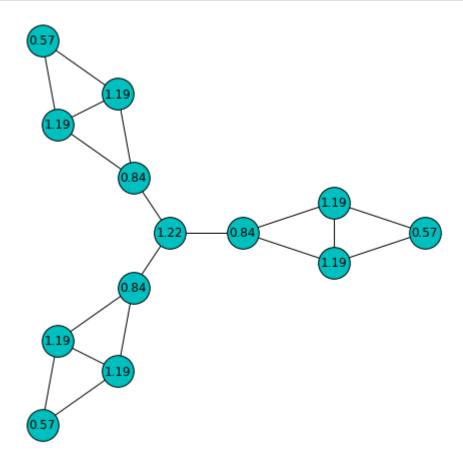




```
In [14]:
           1
              def bonacich_power_centrality(G,alpha,beta):
           2
                  nodelist = G.nodes()
           3
                  R = nx.to_numpy_matrix(G, nodelist)
           4
                  I = np.identity(len(G))
           5
                  one = np.ones([len(G),1])
                  B = alpha * np.linalg.inv(I - beta * R) * R
           6
           7
                  C = B.dot(one)
           8
                  bpc = dict(zip(nodelist, map(float, C)))
           9
                  return bpc
```

```
In [15]: 1    G = nx.read_gml('Graphs/C03.gml')
2    layout = nl.absolute_layout(G, 'px', 'py')
3    b0 = bonacich_power_centrality(G, alpha=0.003, beta=0.35)
4    plt.figure(1,figsize=(6,6))
5    nl.draw_atlas(G, pos=layout, node_color='c', node_size=1000, labels=roffdict
```

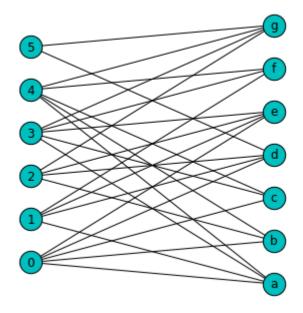




Collaboration Networks

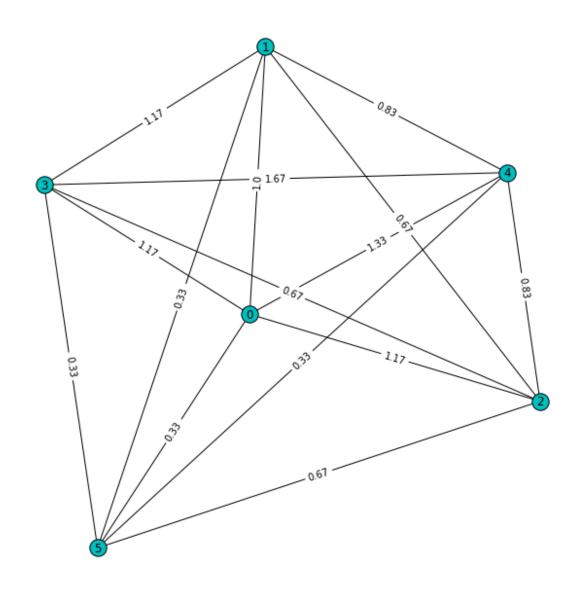
Newman's collaboration weight

```
B = nx.read_gml('Graphs/C04.gml')
layout=nl.absolute_layout(B, 'px', 'py')
In [17]:
             3 plt.figure(1,figsize=(4,4))
                nl.draw_atlas(B, node_color='c', pos=layout, node_size=500)
```



```
In [18]:
             from networkx.algorithms import bipartite
             bottom = list(range(6))
           3 G = bipartite.collaboration_weighted_projected_graph(B, bottom)
             layout=nx.spring layout(G)
             weight = nx.get_edge_attributes(G, 'weight')
           6 print (roffdict(weight))
           7
             plt.figure(1,figsize=(8,8))
             nl.draw_atlas(G, pos=layout, node_color='c', edge_labels=roffdict(weight))
```

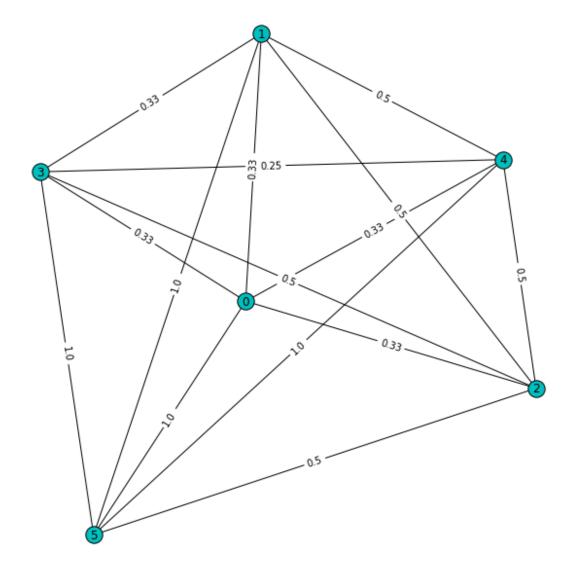
```
\{(0, 1): 1.0, (0, 2): 1.17, (0, 3): 1.17, (0, 4): 1.33, (0, 5): 0.33, (1, 2):
0.67, (1, 3): 1.17, (1, 4): 0.83, (1, 5): 0.33, (2, 3): 0.67, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, (2, 4): 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 0.83, 
5): 0.67, (3, 4): 1.67, (3, 5): 0.33, (4, 5): 0.33}
```



bras-amoros collaboration distance

```
In [19]:
           1
              def bras_amoros_collaboration(B, bottom):
           2
                  G = nx.Graph()
           3
                  G.add_nodes_from(bottom)
           4
           5
                  for x in bottom:
           6
                       for y in bottom:
           7
                           if x == y:
           8
                               continue
                           cnt = len(set(B.neighbors(x)) & set(B.neighbors(y)))
           9
                           if cnt > 0:
          10
          11
                               G.add_edge(x,y,weight=1.0/cnt)
          12
                  return G
          13
          14
```

```
In [20]:
              bcd = bras_amoros_collaboration(B, bottom)
             bweight = nx.get_edge_attributes(bcd, 'weight')
              plt.figure(1,figsize=(8,8))
             nl.draw_atlas(bcd, pos=layout, node_color='c', edge_labels=roffdict(bweight)
```

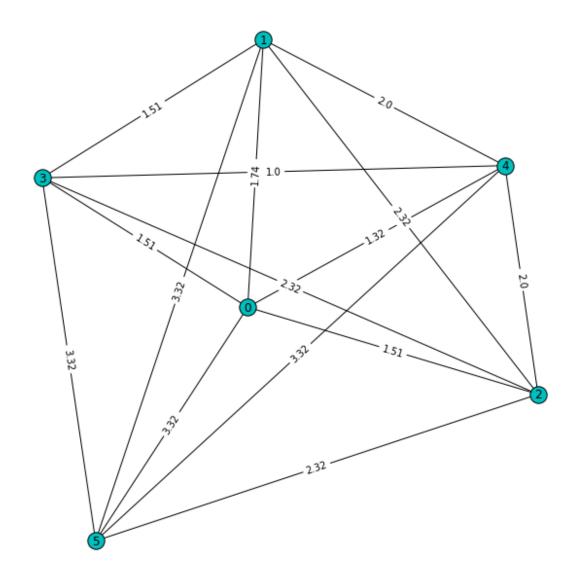


kim's collaboration distance

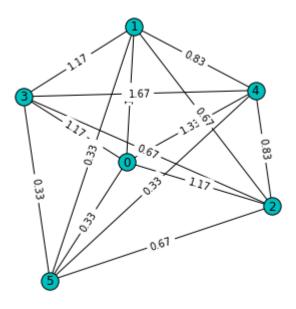
```
In [21]:
              # kim's collaboration distance
           2
              def kim collaboration(B, bottom):
           3
                  G = bipartite.collaboration_weighted_projected_graph(B, bottom)
           4
                  attrs = nx.get_edge_attributes(G, 'weight')
           5
                  edgelist = attrs.keys()
           6
                  weight = attrs.values()
           7
                  wmax = max(weight)
           8
                  kcd = [-np.log2(float(x)/(2*wmax))  for x in weight]
           9
                  nx.set_edge_attributes(G, values=dict(zip(edgelist,kcd)), name='kcw')
          10
                  return G
```

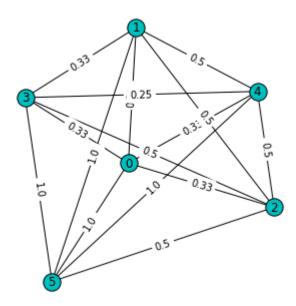
```
In [22]:
             kim = kim_collaboration(B, bottom)
             kcw = nx.get_edge_attributes(kim, 'kcw')
           3 print (roffdict(kcw))
             plt.figure(1,figsize=(8,8))
             nl.draw_atlas(kim, pos=layout, node_color='c', edge_labels=roffdict(kcw))
           6
```

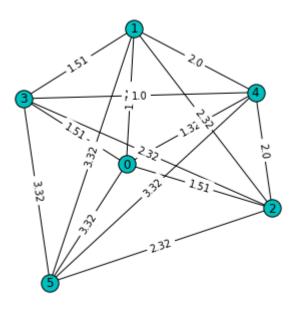
```
\{(0, 1): 1.74, (0, 2): 1.51, (0, 3): 1.51, (0, 4): 1.32, (0, 5): 3.32, (1, 2):
2.32, (1, 3): 1.51, (1, 4): 2.0, (1, 5): 3.32, (2, 3): 2.32, (2, 4): 2.0, (2,
5): 2.32, (3, 4): 1.0, (3, 5): 3.32, (4, 5): 3.32}
```



```
In [23]:
             plt.figure(1,figsize=(4,4))
             nl.draw_atlas(G, pos=layout, node_color='c', edge_labels=roffdict(weight))
           3 plt.figure(2,figsize=(4,4))
             nl.draw_atlas(bcd, pos=layout, node_color='c', edge_labels=roffdict(bweight)
             plt.figure(3,figsize=(4,4))
             nl.draw_atlas(kim, pos=layout, node_color='c', edge_labels=roffdict(kcw))
```

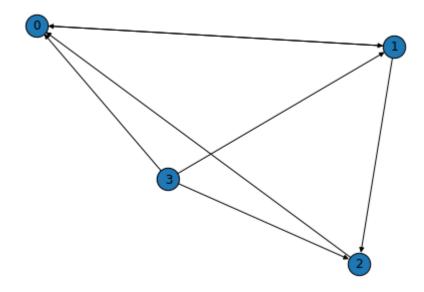






page-rank

```
In [24]:
             G = nx.DiGraph()
             G.add_edge(0,1)
           3 G.add_edge(1,0)
           4 G.add_edge(1,2)
           5 G.add_edge(2,0)
           6 G.add_edge(3,0)
           7
             G.add_edge(3,1)
           8 G.add_edge(3,2)
           9
             nl.draw_atlas(G, node_size=500)
          10
             # nx.pagerank()
```



```
In [25]:
            N = [1, 10, 11, 100]
          2 T = [0.2, 0.002, 0.001, 2e-5]
             print ('%3s %8s %s' % ('n', 't', 'page rank'))
             print ('%3s %8s %s' % ('---', '------'))
            for n, t in zip(N, T):
          5
          6
                 p = nx.pagerank(G, max_iter=n, tol=t, weight=None)
          7
                 pval = list(roff(list(p.values()),4))
          8
                 print ('%3d %7f %s' % (n, t, pval))
```

```
t page rank
 n
    0.200000 [0.4271, 0.3208, 0.2146, 0.0375]
 1
    0.002000 [0.3814, 0.3736, 0.2075, 0.0375]
 10
    0.001000 [0.3833, 0.3724, 0.2069, 0.0375]
 11
    0.000020 [0.3825, 0.3732, 0.2068, 0.0375]
100
```