

## ▼ グラフ理論

ヒューリスティック無しグラフ探索(1)：木の変換から幅優先探索と深さ優先探索、

グラフとはデータ構造の一つである。

グラフ理論では、点（節点またはノード）(Vertex or Vertices or Node)と線（辺）(Edge(s))の有限集合で記述する。

辺とノードの組合せでネットワークグラフを作成する

ノードまたは点の集合 $V(G)$

辺の集合 $E(G)$

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辺とノードの組合せでネットワークグラフを作成する

ノードまたは点の集合 $V(G)$

辺の集合 $E(G)$

```
%matplotlib inline
```

## ▼ 無効グラフの実装

```
simple_edges=[(1, 2), (1, 5), (2, 3), (2, 5), (3, 4), (4, 5), (4, 6)]
```

```
# グラフライブラリを使用する
import networkx as nx
```

```
# グラフデータを入力し、gに格納する
g = nx.Graph(simple_edges)
```

```
print(g.nodes())
```

```
[1, 2, 5, 3, 4, 6]
```

```
print(g.edges())
```

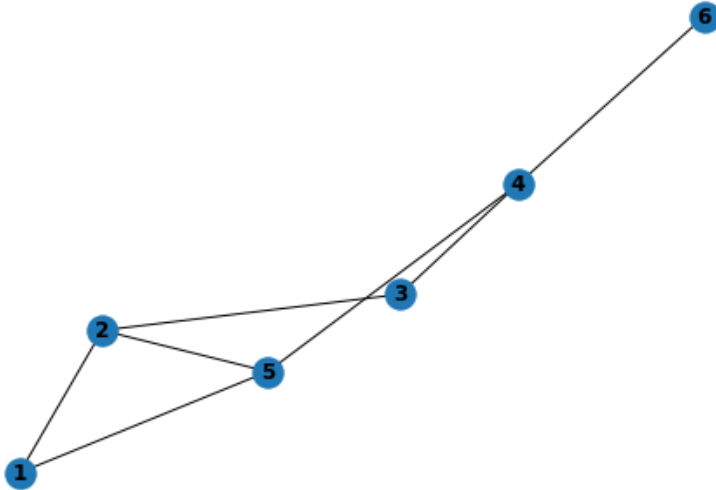
```
[(1, 2), (1, 5), (2, 3), (2, 5), (5, 4), (3, 4), (4, 6)]
```

```
print(nx.adjacency_matrix(g))
```

```
(0, 1)      1
```

```
(0, 2)    1
(1, 0)    1
(1, 2)    1
(1, 3)    1
(2, 0)    1
(2, 1)    1
(2, 4)    1
(3, 1)    1
(3, 4)    1
(4, 2)    1
(4, 3)    1
(4, 5)    1
(5, 4)    1
```

```
nx.draw(g, with_labels=True, font_weight='bold')
```



```
nx.is_tree(g)
```

```
False
```

```
for path in nx.all_simple_paths(g, source=1, target=6):
    print(path)
```

```
[1, 2, 3, 4, 6]
[1, 2, 5, 4, 6]
[1, 5, 2, 3, 4, 6]
[1, 5, 4, 6]
```

```
paths = list(nx.shortest_simple_paths(g, 1, 6))
```

```
print(paths)
```

```
[[1, 5, 4, 6], [1, 2, 3, 4, 6], [1, 2, 5, 4, 6], [1, 5, 2, 3, 4, 6]]
```

```
from itertools import islice
```

```
def k_shortest_paths(G, source, target, k, weight=None):
```

```
    return list(islice(nx.shortest_simple_paths(G, source, target, weight=weight), k))
```

```
for path in k_shortest_paths(g, 1, 6, 2):
```

```
    print(path)
```

```
[1, 5, 4, 6]
[1, 2, 3, 4, 6]
```

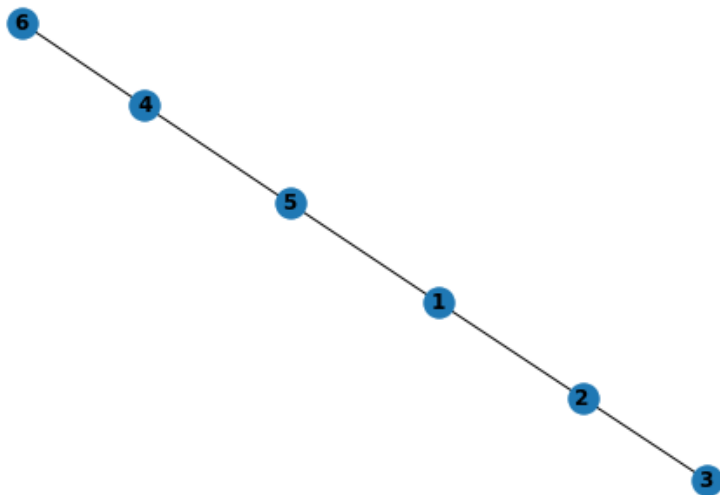
```
Tree_bfs = nx.bfs_edges(g, 1)
```

```
print(list(Tree_bfs))  
  
[(1, 2), (1, 5), (2, 3), (5, 4), (4, 6)]
```

```
Tree_bfs = nx.bfs_edges(g, 1)  
t0 = nx.Graph(list(Tree_bfs))
```

```
t0.nodes()  
  
NodeView((1, 2, 5, 3, 4, 6))
```

```
nx.draw(t0, with_labels=True, font_weight='bold')
```



```
print(list(nx.bfs_successors(g, 1)))  
  
[(1, [2, 5]), (2, [3]), (5, [4]), (4, [6])]
```

```
Trees = nx.dfs_tree(g, 1)  
print(Trees.nodes())
```

```
[1, 2, 3, 4, 5, 6]
```

```
print(Trees.edges())  
  
[(1, 2), (2, 3), (3, 4), (4, 5), (4, 6)]
```

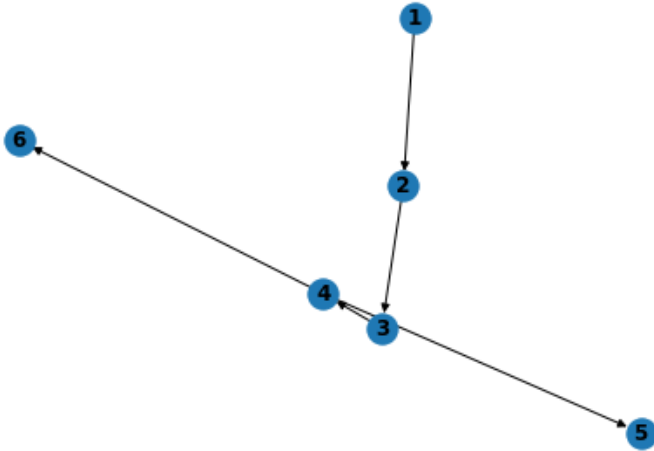
```
nx.draw(Trees, with_labels=True, font_weight='bold')
```

5

```
#g.add_path([1, 5, 2, 3, 4, 6])  
Trees1 = nx.dfs_tree(g, 1)  
print(Trees1.edges())
```

[(1, 2), (2, 3), (3, 4), (4, 5), (4, 6)]

```
nx.draw(Trees1, with_labels=True, font_weight='bold')
```



```
#g.add_path([1, 5, 4, 6])  
Trees1 = nx.dfs_tree(g, 1)  
print(Trees1.edges())
```

[(1, 2), (2, 3), (3, 4), (4, 5), (4, 6)]

```
#ノード1から  
print(list(nx.dfs_preorder_nodes(g, 1)))
```

[1, 2, 3, 4, 5, 6]

```
options = {  
    'node_color': 'red',  
    'node_size': 800,  
    'width': 3,  
    'arrowstyle': '-|>',  
    'arrowsize': 12,  
}
```

```
nx.draw_networkx(g, arrows=True, **options)
```

## ▼ 重み付け有効グラフの実装

```
# Romania Graph

#Heuristics data
Cities = [('Arad', 366), ('Zerind', 374), ('Timisoara', 329),
          ('Sibiu', 253), ('Oradea', 380), ('Lugoj', 244), ('Fagaras', 176),
          ('Rimnicu Vilcea', 193), ('Mehadia', 241), ('Pitesti', 101),
          ('Dobreta', 242), ('Craiova', 160), ('Bucharest', 0),
          ('Giurgiu', 77), ('Urziceni', 80), ('Hirsova', 151),
          ('Eforie', 161), ('Vaslui', 199), ('Iasi', 226), ('Neamt', 234)]

romania_g = nx.Graph(directed=False)

nodes = []
for city, h in Cities:
    nodes.append(city)

#def city_edges(nodes, romania_g):
romania_g.add_edges_from([(nodes[0], nodes[1]), weight=75)
romania_g.add_edges_from([(nodes[0], nodes[2]), weight=118)
romania_g.add_edges_from([(nodes[0], nodes[3]), weight=140)
romania_g.add_edges_from([(nodes[1], nodes[4]), weight=71)

romania_g.add_edges_from([(nodes[4], nodes[3]), weight=151)
romania_g.add_edges_from([(nodes[2], nodes[5]), weight=111)
romania_g.add_edges_from([(nodes[3], nodes[6]), weight=99)
romania_g.add_edges_from([(nodes[3], nodes[7]), weight=80)

#Lugoj -> Mehadia -> Dobreda -> Craiova -> Pitesti
romania_g.add_edges_from([(nodes[5], nodes[8]), weight=70)
romania_g.add_edges_from([(nodes[8], nodes[10]), weight=75)
romania_g.add_edges_from([(nodes[10], nodes[11]), weight=120)
romania_g.add_edges_from([(nodes[11], nodes[9]), weight=138)

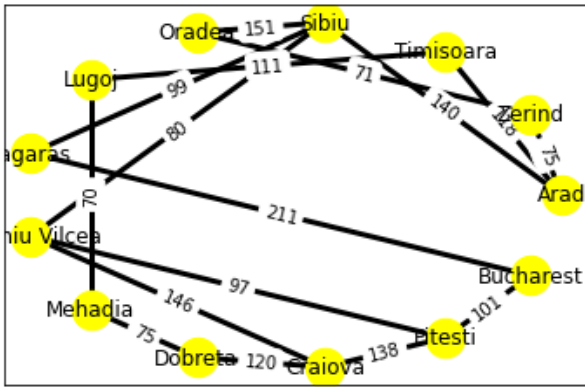
romania_g.add_edges_from([(nodes[6], nodes[12]), weight=211)
romania_g.add_edges_from([(nodes[7], nodes[9]), weight=97)
romania_g.add_edges_from([(nodes[7], nodes[11]), weight=146)
romania_g.add_edges_from([(nodes[9], nodes[12]), weight=101)

# not complete

r_weights = romania_g.edges(data=True)

edge_labels=dict([(u, v, d['weight'])
                  for u, v, d in romania_g.edges(data=True)])

options = {
    'node_color': 'yellow',
    'node_size': 500,
    'width': 3
}
pos=nx.circular_layout(romania_g)
nx.draw_networkx_edge_labels(romania_g, pos, edge_labels=edge_labels)
nx.draw_networkx(romania_g, pos, **options)
```



```
for path in nx.all_simple_paths(romania_g, source='Arad', target='Bucharest'):
    print(path)
```

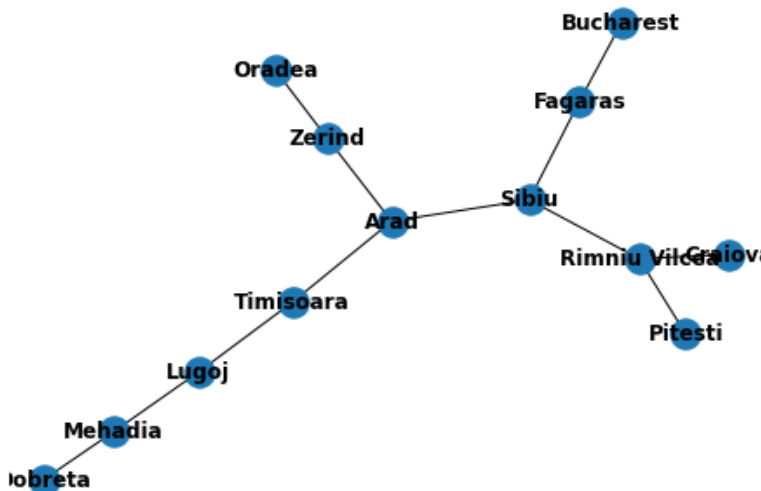
```
['Arad', 'Zerind', 'Oradea', 'Sibiu', 'Fagaras', 'Bucharest']
['Arad', 'Zerind', 'Oradea', 'Sibiu', 'Rimniu Vilcea', 'Pitesti', 'Bucharest']
['Arad', 'Zerind', 'Oradea', 'Sibiu', 'Rimniu Vilcea', 'Craiova', 'Pitesti', 'Bucharest']
['Arad', 'Timisoara', 'Lugoj', 'Mehadia', 'Dobreta', 'Craiova', 'Pitesti', 'Rimniu Vilcea', 'Sibiu', 'Fagaras', 'Bucharest']
['Arad', 'Timisoara', 'Lugoj', 'Mehadia', 'Dobreta', 'Craiova', 'Pitesti', 'Bucharest']
['Arad', 'Timisoara', 'Lugoj', 'Mehadia', 'Dobreta', 'Craiova', 'Rimniu Vilcea', 'Sibiu', 'Fagaras', 'Bucharest']
['Arad', 'Timisoara', 'Lugoj', 'Mehadia', 'Dobreta', 'Craiova', 'Rimniu Vilcea', 'Pitesti', 'Bucharest']
['Arad', 'Sibiu', 'Fagaras', 'Bucharest']
['Arad', 'Sibiu', 'Rimniu Vilcea', 'Pitesti', 'Bucharest']
['Arad', 'Sibiu', 'Rimniu Vilcea', 'Craiova', 'Pitesti', 'Bucharest']
```

```
from itertools import islice
def k_shortest_paths(G, source, target, k, weight=None):
    return list(islice(nx.shortest_simple_paths(G, source, target, weight=weight), k))
for path in k_shortest_paths(romania_g, 'Arad', 'Bucharest', 2):
    print(path)
```

```
['Arad', 'Sibiu', 'Fagaras', 'Bucharest']
['Arad', 'Sibiu', 'Rimniu Vilcea', 'Pitesti', 'Bucharest']
```

```
Tree_bfs = nx.bfs_edges(romania_g, 'Arad')
t0 = nx.Graph(list(Tree_bfs))
```

```
nx.draw(t0, with_labels=True, font_weight='bold')
```

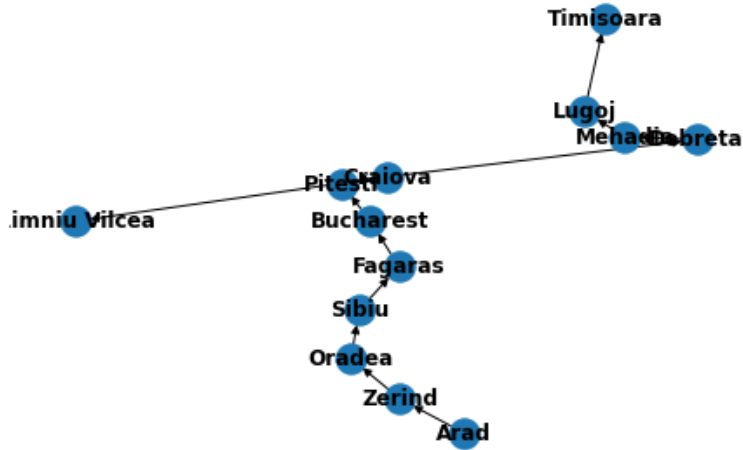


```
Trees = nx.dfs_tree(romania_g, 'Arad')
#print(Trees.nodes())
```

```
print(Trees.nodes())
```

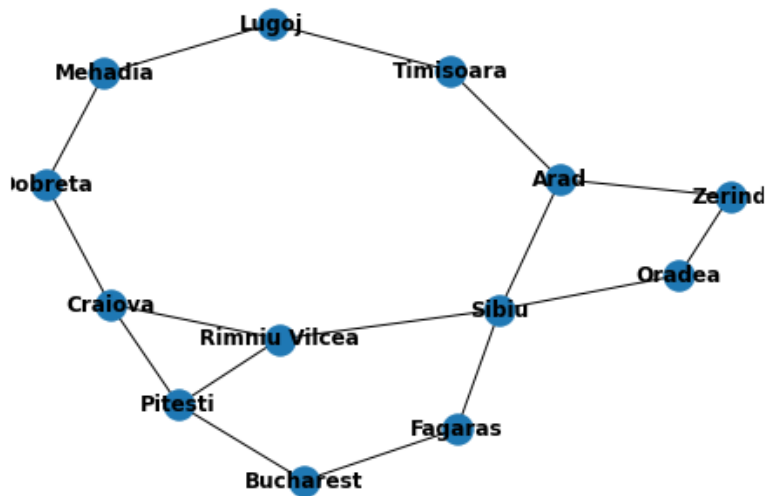
```
#print(Trees.edges())
```

```
nx.draw(Trees, with_labels=True, font_weight='bold')
```



```
Tree_dfs = list(nx.edge_dfs(nx.Graph(romania_g.edges()), romania_g.nodes()))  
t0 = nx.Graph(list(Tree_dfs))
```

```
nx.draw(t0, with_labels=True, font_weight='bold')
```



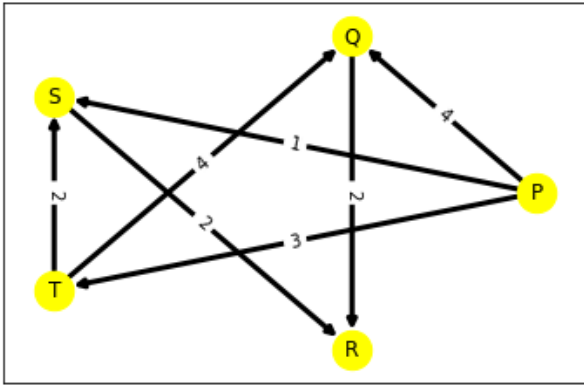
```
Tree_dfs = list(nx.edge_dfs(romania_g, 'Arad'))  
t1 = nx.Graph(list(Tree_dfs))  
nx.draw(t1, with_labels=True, font_weight='bold')
```





```
for u, v, w in wg.edges(data=True):
```

```
pos=nx.circular_layout(wg)
nx.draw_networkx_edge_labels(wg, pos, edge_labels=edge_labels)
nx.draw_networkx(wg, pos, **options)
```



```
L={'A':{'C':2,'D':6},'B':{'D':8,'A':3},
   'C':{'D':7,'E':5},'D':{'E':-2},'E':{}}
```

```
class Graph:
    def __init__(self, g):
        self.g=g
    def Vertex(self):
        return self.g.keys()
    def Adj(self, v):
        return self.g[v].keys()
    def w(self, u, v):
        return self.g[u][v]
```

```
G=Graph(L)
```

```
print("グラフのポインタ: %s" % (G))
print("グラフの全体: %s" % (G.g))
print("ノードの集合: %s" % (G.Vertex()))
print("ノード'D'に隣接するノードのリスト: %s" % (G.Adj('D')))
```

```
グラフのポインタ: <__main__.Graph object at 0x7fcfc31b7748>
グラフの全体: {'A': {'C': 2, 'D': 6}, 'B': {'D': 8, 'A': 3}, 'C': {'D': 7, 'E': 5}, 'D': {'E': -2}, 'E': {}}
ノードの集合: dict_keys(['A', 'B', 'C', 'D', 'E'])
ノード'D'に隣接するノードのリスト: dict_keys(['E'])
```

```
nodes = list(G.Vertex())
```

```
nodes
```

```
['A', 'B', 'C', 'D', 'E']
```

```
L_edges = []
for node in nodes:
    adj_nodes = list(G.Adj(node))
    adj_edges = [(node, some_node) for some_node in adj_nodes]
    L_edges += adj_edges
```

```
L_edges
```

```
[('A', 'C'),
```

```

('A', 'D'),
('B', 'D'),
('B', 'A'),
('C', 'D'),
('C', 'E'),
('D', 'E')]

```

```

L_edges_w=[]
for each in L_edges:
    u,v = each
    L_edges_w.append((u,v,G.w(u,v)))
    #print(G.w(u,v), end=' ')
L_edges_w

```

```

[('A', 'C', 2),
 ('A', 'D', 6),
 ('B', 'D', 8),
 ('B', 'A', 3),
 ('C', 'D', 7),
 ('C', 'E', 5),
 ('D', 'E', -2)]

```

```

wg = nx.DiGraph(directed=True)

```

```

for each in L_edges_w:
    u,v,w = each
    edge = [(u,v)]
    wg.add_edges_from(edge,weight=w)

```

```

import matplotlib.pyplot as plt
limits = plt.axis('off') # turn of axis

```

```

edge_labels=dict([(u,v),d['weight']]
                  for u,v,d in wg.edges(data=True)])

```

```

edge_labels

```

```

{('A', 'C'): 2,
 ('A', 'D'): 6,
 ('B', 'A'): 3,
 ('B', 'D'): 8,
 ('C', 'D'): 7,
 ('C', 'E'): 5,
 ('D', 'E'): -2}

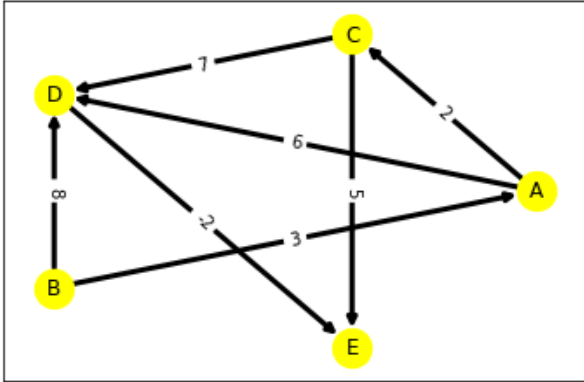
```

```

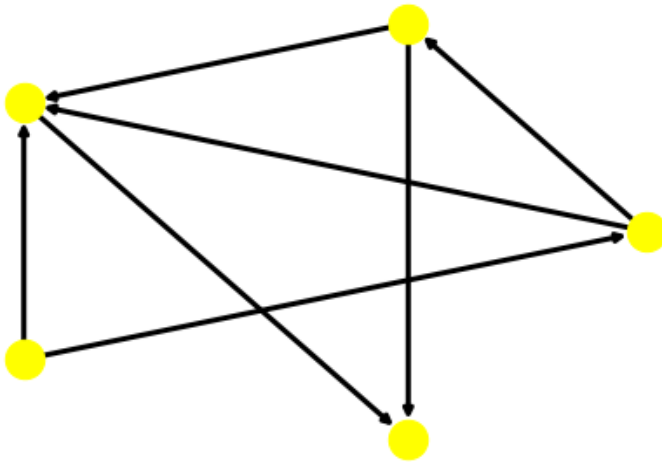
pos=nx.circular_layout(wg)
nx.draw_networkx_edge_labels(wg, pos, edge_labels=edge_labels)
nx.draw_networkx(wg, pos, arrows=True, **options)

```

```
nx.draw(wg, pos, arrows=True, **options)
```



```
nx.draw(wg, pos, arrows=True, **options)
```



```
# Example 2019/11/19
```

```
g1 = nx.Graph(directed=False)
```

```
g1.add_edges_from([('A', 'B')], weight=3)
```

```
g1.add_edges_from([('A', 'C')], weight=2)
```

```
g1.add_edges_from([('A', 'E')], weight=9)
```

```
g1.add_edges_from([('B', 'E')], weight=2)
```

```
g1.add_edges_from([('B', 'D')], weight=4)
```

```
g1.add_edges_from([('C', 'E')], weight=6)
```

```
g1.add_edges_from([('C', 'F')], weight=9)
```

```
g1.add_edges_from([('D', 'G')], weight=3)
```

```
g1.add_edges_from([('E', 'G')], weight=1)
```

```
g1.add_edges_from([('E', 'H')], weight=2)
```

```
g1.add_edges_from([('C', 'F')], weight=9)
```

```
g1.add_edges_from([('F', 'H')], weight=1)
```

```
g1.add_edges_from([('F', 'I')], weight=2)
```

```
g1.add_edges_from([('G', 'J')], weight=5)
```

```
g1.add_edges_from([('I', 'K')], weight=2)
```

```
g1.add_edges_from([('H', 'J')], weight=5)
```

```
g1.add_edges_from([('H', 'I')], weight=0)
```

```

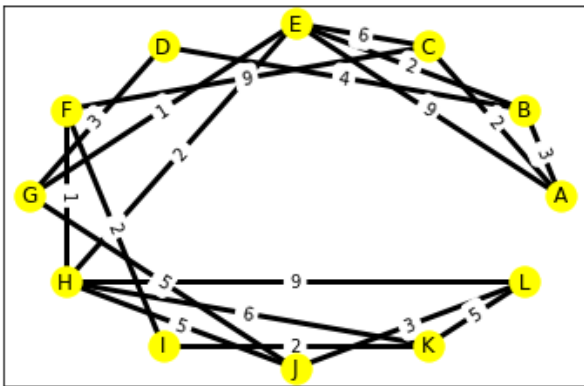
g1.add_edges_from([(H, 'L'), weight=9),
g1.add_edges_from([('H', 'K')], weight=6)

g1.add_edges_from([('K', 'L')], weight=5)
g1.add_edges_from([('J', 'L')], weight=3)

edge_labels=dict([(u, v, d['weight'])
                  for u, v, d in g1.edges(data=True)])

options = {
    'node_color': 'yellow',
    'node_size': 300,
    'width': 3
}
pos=nx.circular_layout(g1)
nx.draw_networkx_edge_labels(g1, pos, edge_labels=edge_labels)
nx.draw_networkx(g1, pos, arrows=True, **options)

```



```

print(g1.edges(data=True))

[('A', 'B', {'weight': 3}), ('A', 'C', {'weight': 2}), ('A', 'E', {'weight': 9}), ('B', 'E', {'weight': 2}),

```

```

for path in nx.all_simple_paths(g1, source='A', target='L'):
    print(path)

```

```

['A', 'B', 'E', 'H', 'F', 'I', 'K', 'L']
['A', 'B', 'E', 'H', 'J', 'L']
['A', 'B', 'E', 'H', 'L']
['A', 'B', 'E', 'H', 'K', 'L']
['A', 'B', 'D', 'G', 'E', 'C', 'F', 'H', 'J', 'L']
['A', 'B', 'D', 'G', 'E', 'C', 'F', 'H', 'L']
['A', 'B', 'D', 'G', 'E', 'C', 'F', 'H', 'K', 'L']
['A', 'B', 'D', 'G', 'E', 'C', 'F', 'I', 'K', 'H', 'J', 'L']
['A', 'B', 'D', 'G', 'E', 'C', 'F', 'I', 'K', 'H', 'L']
['A', 'B', 'D', 'G', 'E', 'C', 'F', 'I', 'K', 'L']
['A', 'B', 'D', 'G', 'E', 'H', 'F', 'I', 'K', 'L']
['A', 'B', 'D', 'G', 'E', 'H', 'J', 'L']

['A', 'B', 'D', 'G', 'E', 'H', 'L']
['A', 'B', 'D', 'G', 'E', 'H', 'K', 'L']
['A', 'B', 'D', 'G', 'J', 'H', 'E', 'C', 'F', 'I', 'K', 'L']
['A', 'B', 'D', 'G', 'J', 'H', 'F', 'I', 'K', 'L']
['A', 'B', 'D', 'G', 'J', 'H', 'L']
['A', 'B', 'D', 'G', 'J', 'H', 'K', 'L']
['A', 'B', 'D', 'G', 'J', 'L']
['A', 'C', 'E', 'B', 'D', 'G', 'J', 'H', 'F', 'I', 'K', 'L']
['A', 'C', 'E', 'B', 'D', 'G', 'J', 'H', 'L']
['A', 'C', 'E', 'B', 'D', 'G', 'J', 'H', 'K', 'L']

```

```

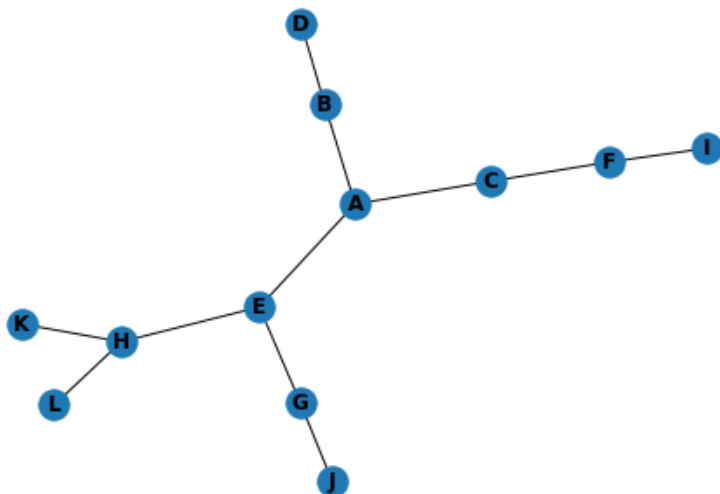
['A', 'C', 'E', 'B', 'D', 'G', 'J', 'L']
['A', 'C', 'E', 'G', 'J', 'H', 'F', 'I', 'K', 'L']
['A', 'C', 'E', 'G', 'J', 'H', 'L']
['A', 'C', 'E', 'G', 'J', 'H', 'K', 'L']
['A', 'C', 'E', 'G', 'J', 'L']
['A', 'C', 'E', 'H', 'F', 'I', 'K', 'L']
['A', 'C', 'E', 'H', 'J', 'L']
['A', 'C', 'E', 'H', 'L']
['A', 'C', 'E', 'H', 'K', 'L']
['A', 'C', 'F', 'H', 'E', 'B', 'D', 'G', 'J', 'L']
['A', 'C', 'F', 'H', 'E', 'G', 'J', 'L']
['A', 'C', 'F', 'H', 'J', 'L']
['A', 'C', 'F', 'H', 'L']
['A', 'C', 'F', 'H', 'K', 'L']
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['A', 'C', 'F', 'I', 'K', 'H', 'J', 'L']
['A', 'C', 'F', 'I', 'K', 'H', 'L']
['A', 'C', 'F', 'I', 'K', 'L']
['A', 'E', 'B', 'D', 'G', 'J', 'H', 'F', 'I', 'K', 'L']
['A', 'E', 'B', 'D', 'G', 'J', 'H', 'L']
['A', 'E', 'B', 'D', 'G', 'J', 'H', 'K', 'L']
['A', 'E', 'B', 'D', 'G', 'J', 'L']
['A', 'E', 'C', 'F', 'H', 'J', 'L']
['A', 'E', 'C', 'F', 'H', 'L']
['A', 'E', 'C', 'F', 'H', 'K', 'L']
['A', 'E', 'C', 'F', 'I', 'K', 'H', 'J', 'L']
['A', 'E', 'C', 'F', 'I', 'K', 'H', 'L']
['A', 'E', 'C', 'F', 'I', 'K', 'L']
['A', 'E', 'G', 'J', 'H', 'F', 'I', 'K', 'L']
['A', 'E', 'G', 'J', 'H', 'L']
['A', 'E', 'G', 'J', 'H', 'K', 'L']
['A', 'E', 'G', 'J', 'L']
['A', 'E', 'H', 'F', 'I', 'K', 'L']
['A', 'E', 'H', 'J', 'L']
['A', 'E', 'H', 'L']
['A', 'E', 'H', 'K', 'L']

```

```

Tree_bfs = nx.bfs_edges(g1, 'A')
t0 = nx.Graph(list(Tree_bfs))
nx.draw(t0, with_labels=True, font_weight='bold')

```



## ▼ ヒューリスティック無しグラフ探索(2)

- 均一コスト探索 (ダイクストラ法: dijkstra algorithm)

- 双方向探索 (そうほうこう) 同時に2つの方向から探索を行う (bidirectional search)

```
%matplotlib inline
```

```
# グラフライブラリを使用する
```

```
import networkx as nx
```

```
#L={'A':{'C':2,'D':6},'B':{'D':8,'A':3},  
#   'C':{'D':7,'E':5},'D':{'E':-2},'E':{}}
```

```
# Example 2019/11/19
```

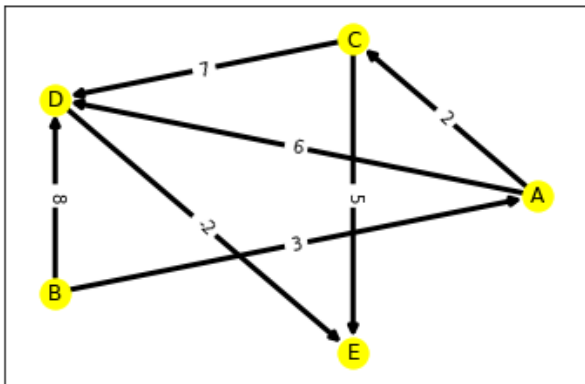
```
g0 = nx.DiGraph(directed=True)
```

```
g0.add_edges_from([('A','C')],weight=2)  
g0.add_edges_from([('A','D')],weight=6)  
g0.add_edges_from([('B','D')],weight=8)  
g0.add_edges_from([('B','A')],weight=3)  
g0.add_edges_from([('C','D')],weight=7)  
g0.add_edges_from([('C','E')],weight=5)  
g0.add_edges_from([('D','E')],weight=-2)
```

```
edge_labels=dict([(u,v),d['weight']]  
                 for u,v,d in g0.edges(data=True))
```

```
options = {  
    'node_color': 'yellow',  
    'node_size': 300,  
    'width': 3  
}
```

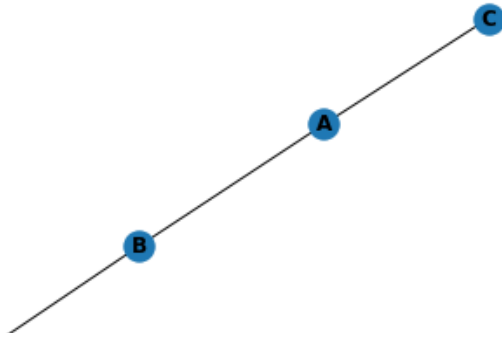
```
}  
pos=nx.circular_layout(g0)  
nx.draw_networkx_edge_labels(g0, pos, edge_labels=edge_labels)  
nx.draw_networkx(g0, pos, arrows=True, **options)
```



```
Tree_bfs = nx.bfs_edges(g0, 'B')
```

```
t0 = nx.Graph(list(Tree_bfs))
```

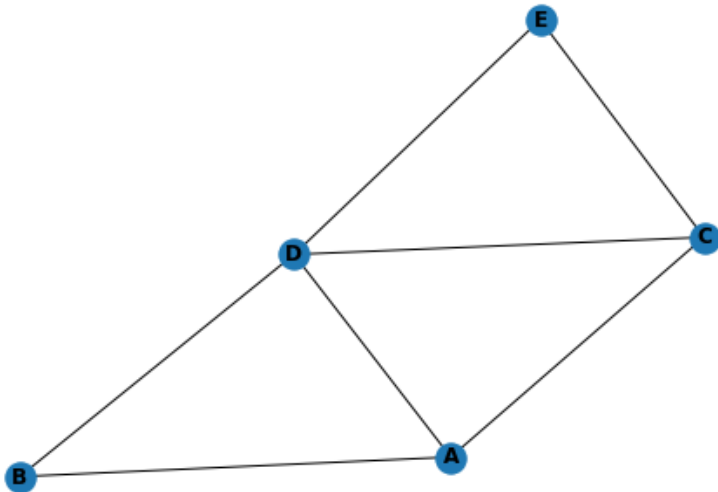
```
nx.draw(t0, with_labels=True, font_weight='bold')
```



```
for path in nx.all_simple_paths(g0, source='B', target='E'):
    print(path)
```

```
['B', 'D', 'E']
['B', 'A', 'C', 'D', 'E']
['B', 'A', 'C', 'E']
['B', 'A', 'D', 'E']
```

```
Tree_dfs = list(nx.edge_dfs(g0, 'B'))
t1 = nx.Graph(list(Tree_dfs))
nx.draw(t1, with_labels=True, font_weight='bold')
```



```
list(Tree_dfs)
```

```
[('B', 'D'),
 ('D', 'E'),
 ('B', 'A'),
 ('A', 'C'),
 ('C', 'D'),
 ('C', 'E'),
 ('A', 'D')]
```

```
#dijkstra_path
path = nx.dijkstra_path(g0, source='B', target='E', weight='weight')
print(path)
```

```
['B', 'D', 'E']
```

```
nodes, dist = nx.dijkstra_predecessor_and_distance(g0, source='B')
print(nodes)
print(dist)
```

```
{'B': [], 'D': ['B'], 'A': ['B'], 'C': ['A'], 'E': ['D']}
```

```
{'B': 0, 'A': 3, 'C': 5, 'D': 8, 'E': 6}
```

```
#Path length
```

```
length = nx.dijkstra_path_length(g0, source='B', target='E', weight='weight')  
print(length)
```

```
6
```

```
length, path=nx.bidirectional_dijkstra(g0, 'B', 'E')
```

```
print(length)
```

```
6
```

```
print(path)
```

```
['B', 'D', 'E']
```