



## Graphs tutorial

In this activity we are going to explore how we can build, manipulate and search graphs.

We use the `networkx` library for dealing with graphs.

```
In [ ]: import networkx as nx
```

Another tutorial is available [here](#).

## Adding nodes and edges

Use the class `MultiDiGraph` to create a directed graph with multiple edges and self-loops.

```
In [ ]: G = nx.DiGraph() # Directed
G = nx.MultiDiGraph()
```

Add nodes using `add_node` :

```
In [ ]: G.add_node('node1')
G.add_node('node2')
G.add_node('node3')
G
```

```
Out [ ]: <networkx.classes.multidigraph.MultiDiGraph at 0xffff9105b850>
```

Check that a node is in the graph:

```
In [ ]: assert 'node1' in G
```

Get all nodes:

```
In [ ]: list(G.nodes())
```

```
Out [ ]: ['node1', 'node2', 'node3']
```

Add some edges:

```
In [ ]: G.add_edge('node1', 'node2');
```

Nodes get automatically added:

```
In [ ]: G.add_edge('node2', 'another1');
G.add_edge('another1', 'another2');
```

List edges:

```
In [ ]: # list of 2-tuples (from, to)
list(G.edges())
```

```
Out[ ]: [('node1', 'node2'), ('node2', 'another1'), ('another1', 'another2')]
```

```
In [ ]: for a,b in G.edges():
        print('edge from %s to %s' % (a, b))
```

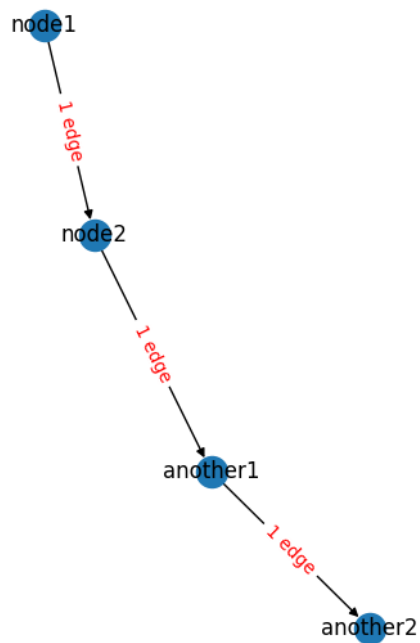
```
edge from node1 to node2
edge from node2 to another1
edge from another1 to another2
```

## Drawing graphs

There are some minimal plotting capabilities.

```
In [ ]: def draw_graph(G0, pos=None):
        from matplotlib import pyplot as plt
        pos = pos or nx.spring_layout(G0)
        plt.figure(figsize=(12, 12))
        ax = plt.gca()
        nx.draw(G0, pos=pos, labels={node:node for node in G0.nodes()})
        #nx.draw(G0, labels={node:node for node in G0.nodes()})
        def edge_label(a, b):
            datas = G0.get_edge_data(a, b)
            s = '%d edge%s' % (len(datas), 's' if len(datas)>=2 else '')
            for k, v in datas.items():
                if v:
                    if 'label' in v:
                        s += '\n %s' % v['label']
                    else:
                        s += '\n %s' % v
            return s
        edge_labels = dict([(a,b), edge_label(a,b)] for a,b in G0.edges())
        nx.draw_networkx_edge_labels(G0, pos, edge_labels=edge_labels, font_color='r')
        plt.axis('off')
        plt.show()
```

```
In [ ]: draw_graph(G)
```



## Multiple edges

You can add a second edge between the nodes:

```
In [ ]: G.add_edge('node1', 'node2');
```

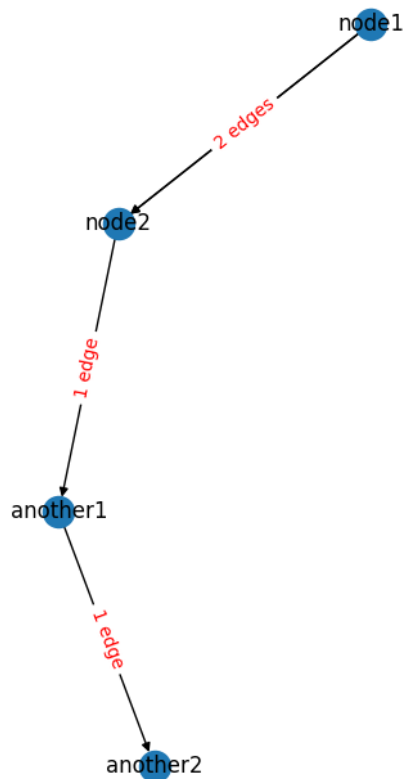
Notice now how there are two copies of the same edge:

```
In [ ]: list(G.edges())
```

```
Out[ ]: [('node1', 'node2'),  
         ('node1', 'node2'),  
         ('node2', 'another1'),  
         ('another1', 'another2')]
```

Multiple edges in the graph:

```
In [ ]: draw_graph(G)
```



node3

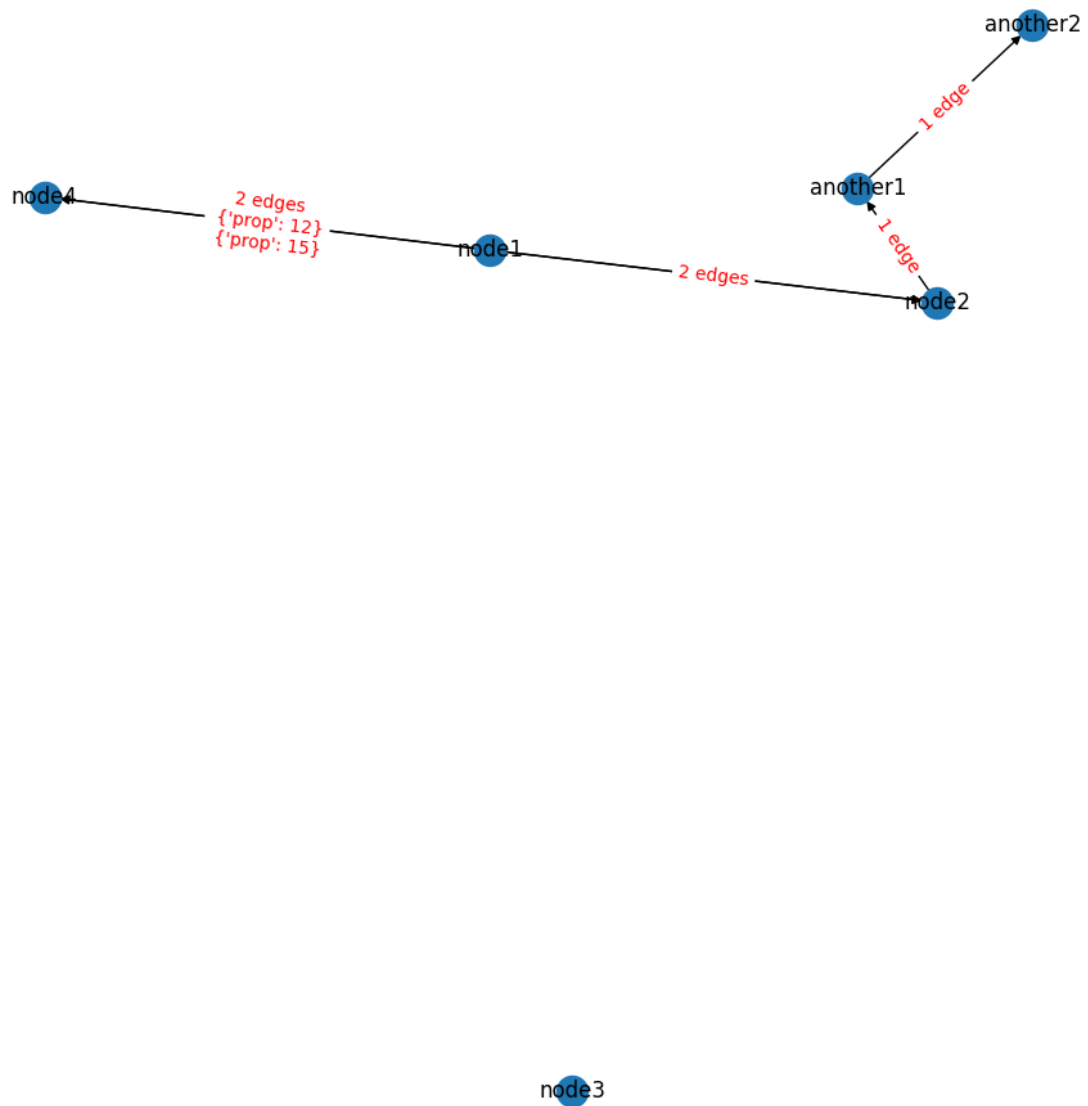
## Attaching data to edges

You can use the optional parameters of the `add_edge` method to attach some pieces of data.

For example we add two more edges between `node1` and `node4` with property `prop` set to 12 and 15.

```
In [ ]: G.add_edge('node1', 'node4', prop=12);  
G.add_edge('node1', 'node4', prop=15);
```

```
In [ ]: draw_graph(G)
```



Using the function `get_edge_data` we can get the data attached to the edge. The function returns a dictionary 'edge-label -> properties', where `edge-label` is just an integer.

```
In [ ]: data = G.get_edge_data('node1', 'node4');
        print(data)
```

```
{0: {'prop': 12}, 1: {'prop': 15}}
```

```
In [ ]: for id_edge, edge_data in data.items():
        print('edge %s: attribute prop = %s' % (id_edge, edge_data['prop']))
```

```
edge 0: attribute prop = 12
edge 1: attribute prop = 15
```

## Querying the graph

Concepts:

- neighbors: all nodes to which a node N connects
- predecessors: all nodes connected to N
- ancestors (transitive closure of predecessors)
- successors
- descendants (transitive closure of successors)

```
In [ ]: list(G.predecessors('node2'))
```

```
Out[ ]: ['node1']
```

```
In [ ]: list(nx.ancestors(G, 'another2'))
```

```
Out[ ]: ['node1', 'node2', 'another1']
```

```
In [ ]: list(G.successors('node2'))
```

```
Out[ ]: ['another1']
```

```
In [ ]: list(nx.descendants(G, 'node2'))
```

```
Out[ ]: ['another2', 'another1']
```

## Cycles

Use the function `nx.simple_cycles` to get the cycles in the graph:

```
In [ ]: list(nx.simple_cycles(G))
```

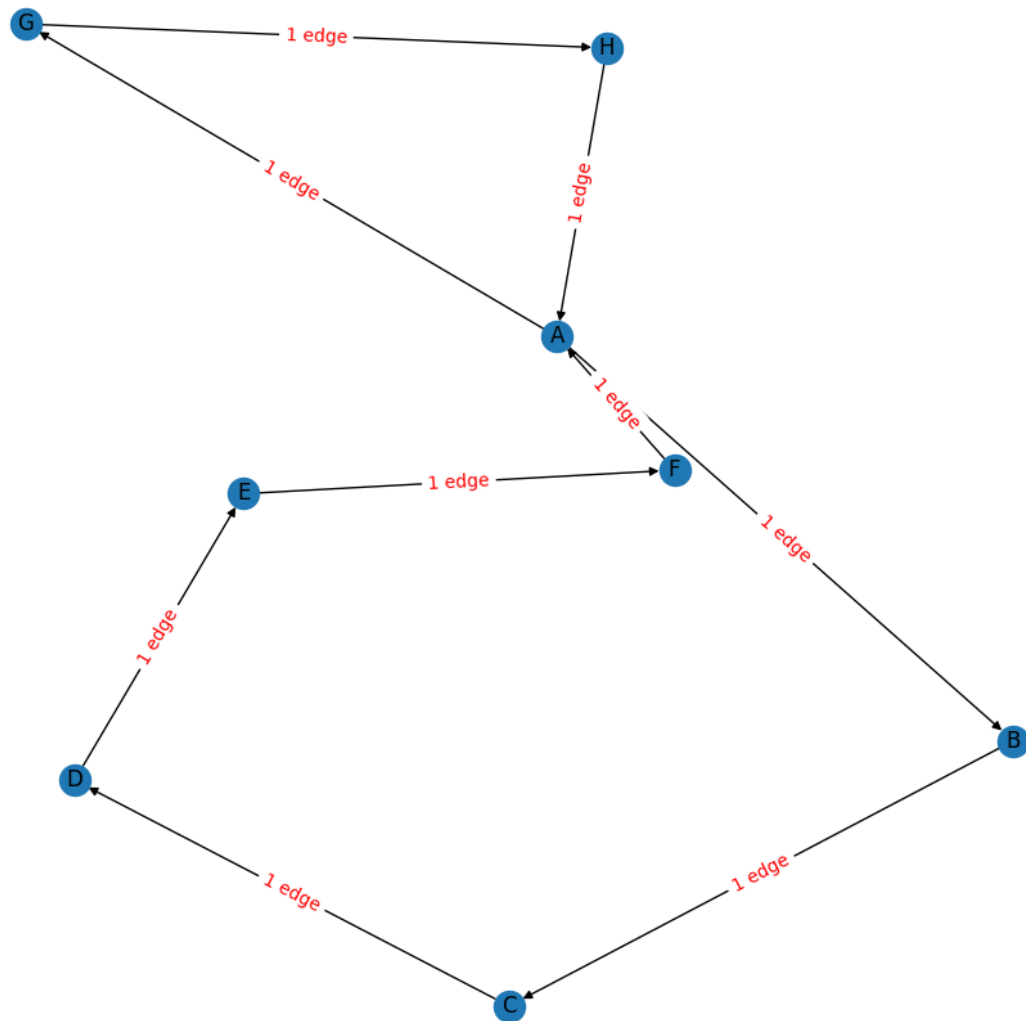
```
Out[ ]: []
```

Let's create a more interesting graph:

```
In [ ]: G2 = nx.MultiDiGraph()
edges = [
    ('A', 'B'),
    ('B', 'C'),
    ('C', 'D'),
    ('D', 'E'),
    ('E', 'F'),
    ('F', 'A'),

    ('A', 'G'),
    ('G', 'H'),
    ('H', 'A')]
G2.add_edges_from(edges);
```

```
In [ ]: draw_graph(G2)
```



The function returns a list of lists:

```
In [ ]: list(nx.simple_cycles(G2))
```

```
Out[ ]: [['D', 'E', 'F', 'A', 'B', 'C'], ['G', 'H', 'A']]
```

## Paths

Use `has_path` to check that two nodes are connected:

```
In [ ]: nx.has_path(G2, 'A', 'C')
```

```
Out[ ]: True
```

```
In [ ]: nx.has_path(G2, 'C', 'A')
```

```
Out[ ]: True
```

But what are these paths? Use `nx.shortest_path` to find out:

```
In [ ]: nx.shortest_path(G2, 'A', 'C')
```

```
Out[ ]: ['A', 'B', 'C']
```

```
In [ ]: nx.shortest_path(G2, 'C', 'A')
```

```
Out[ ]: ['C', 'D', 'E', 'F', 'A']
```

## Attaching data to nodes

Use kwargs of `add_node` to add attributes to nodes:

```
In [ ]: M = nx.DiGraph()
M.add_node('a', q=2)
```

Get it back using this syntax:

```
In [ ]: M.nodes['a']
```

```
Out[ ]: {'q': 2}
```

## Example: pose network

We create a *pose network*: a graph where each node represents a pose and each edge is a measurement.

Let's create a grid-like network:

```
In [ ]: H, W = 4, 4
grid_size = 0.61
```

```
In [ ]: import itertools
import geometry as geo
M = nx.MultiDiGraph()
for i, j in itertools.product(range(H), range(W)):
    # node name is a tuple
    node_name = (i, j)
    # create a pose
    q = geo.SE2_from_translation_angle((i*grid_size, j*grid_size), 0)
    M.add_node(node_name, q=q) # q as property
```

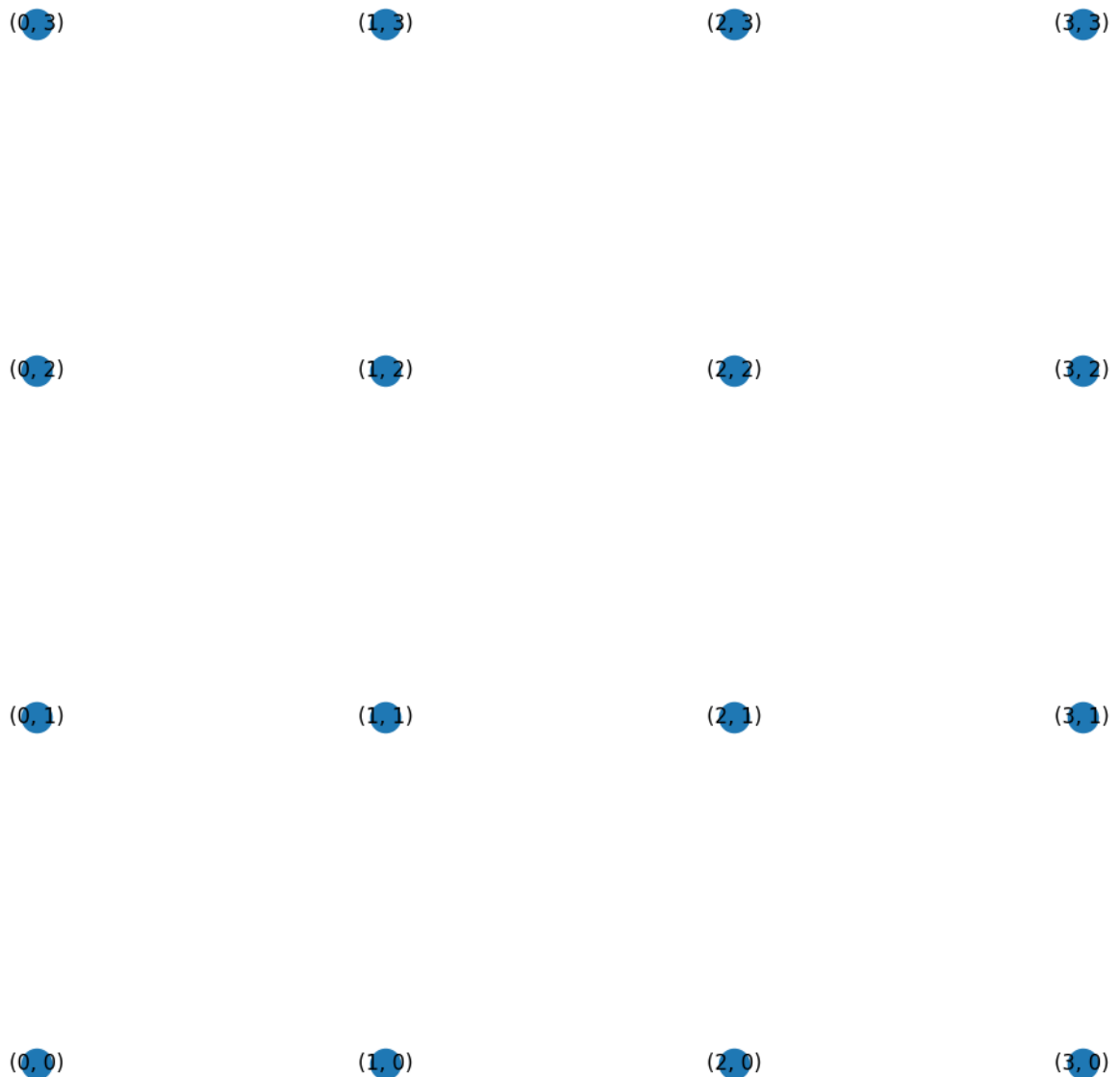
```
DEBUG:commons:version: 6.2.4 *
DEBUG:typing:version: 6.2.3
DEBUG:geometry:PyGeometry-z6 version 2.1.4 path /usr/local/lib/python3.8/dist-packages
```



```
In [ ]: # let's plot them where they are supposed to go
def position_for_node(node):
    # node is a tuple (i,j)
    # query the node properties
    properties = M.nodes[node]
    # get the pose set before
    q = properties['q']
    # extract the translation
    t, _ = geo.translation_angle_from_SE2(q)
    # that's my position
    return t

pos = dict([(node, position_for_node(node)) for node in M])

draw_graph(M, pos=pos)
```



Now let's create the network connections:

```
In [ ]: geo.SE2.friendly(geo.SE2.identity())
```

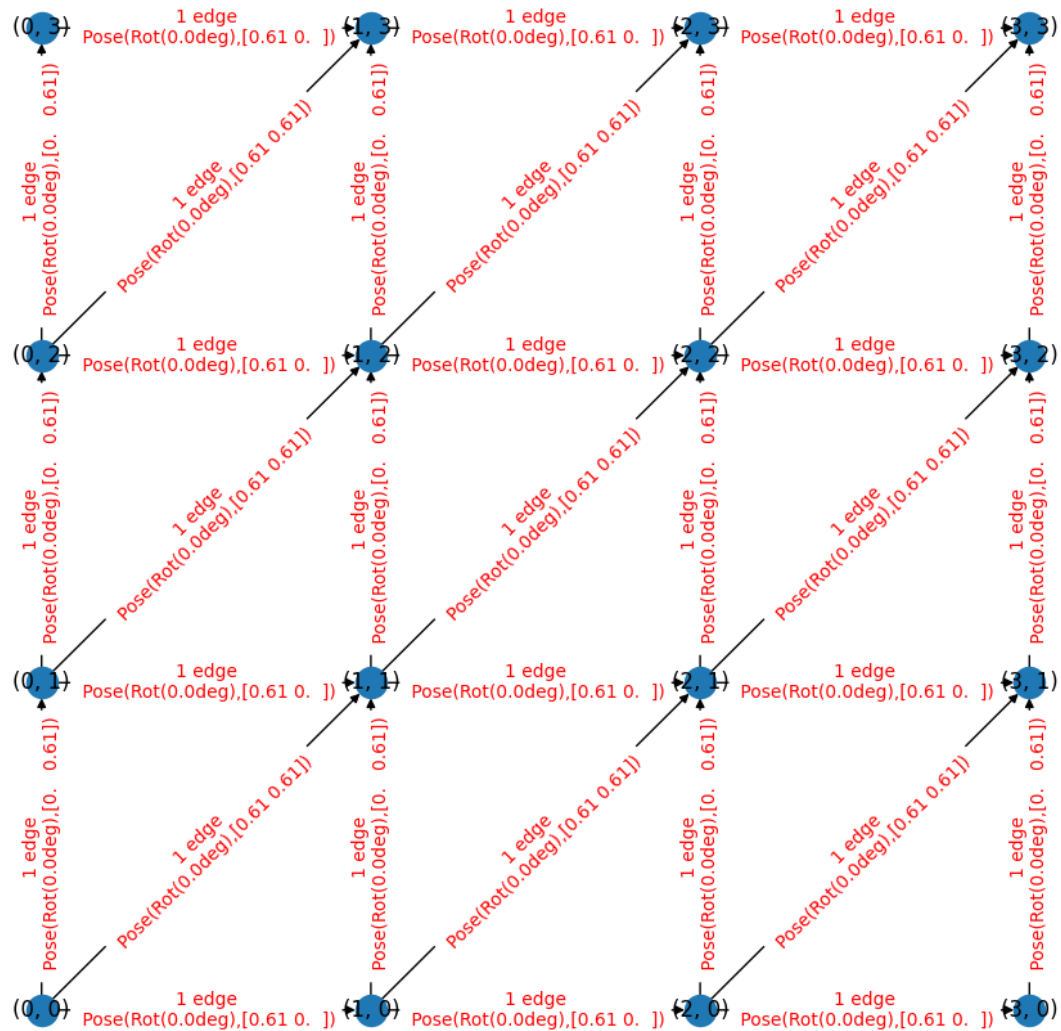
```
Out[ ]: 'Pose(Rot(0.0deg),[0. 0.])'
```

```
In [ ]: for i, j in itertools.product(range(H), range(W)):
        # for each node

        # connect to neighbors
        for d in [(+1, 0), (0, +1), (+1,+1)]:
            # neighbors coordinates
            i2, j2 = i+d[0], j+d[1]
            # if neighbor exists
            if (i2,j2) in M:
                # add the connection

                # pose of the first node
                q1 = M.nodes[(i,j)]['q']
                # pose of the second node
                q2 = M.nodes[(i2,j2)]['q']
                # relative pose
                relative_pose = geo.SE2.multiply(geo.SE2.inverse(q1), q2)
                # label
                label = geo.SE2.friendly(relative_pose)
                # add the edge with two properties "label" and "relative_pose"
                M.add_edge( (i,j), (i2,j2), label=label, relative_pose=relative_
```

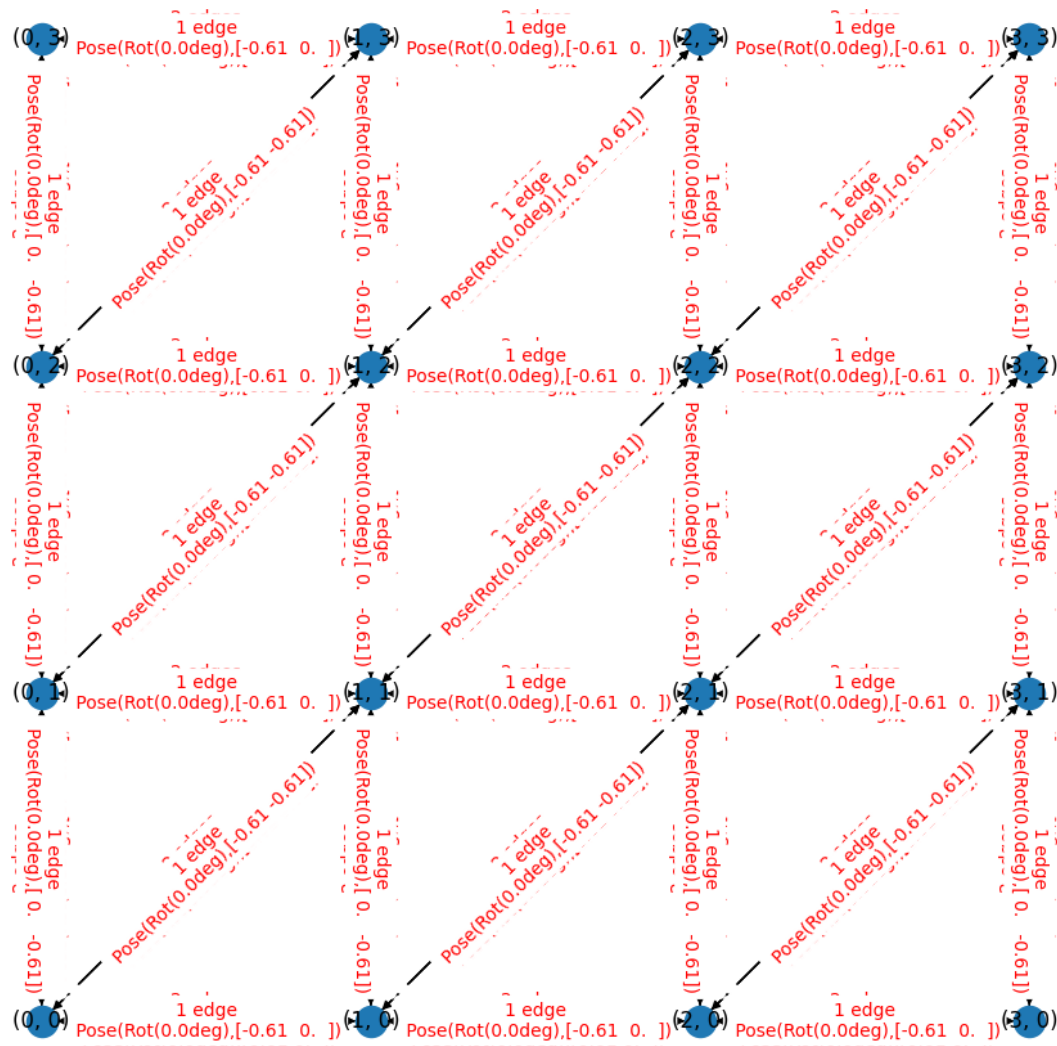
```
In [ ]: draw_graph(M, pos=pos)
```



Now let's find the relative position between two nodes using the graph functions.

```
In [ ]: # let's add inverse edges
for node1, node2 in M.edges():
    for id_edge, edge_data in M.get_edge_data(node1, node2).items():
        r = edge_data['relative_pose']
        rinv = geo.SE2.inverse(r)
        label = geo.SE2.friendly(rinv)
        M.add_edge(node2, node1, relative_pose=rinv, label=label)
```

```
In [ ]: draw_graph(M, pos=pos)
```



```
In [ ]: node1, node2 = (1,3), (2,1)
```

```
In [ ]: path = nx.shortest_path(M, node1, node2)
print(path)
```

```
[(1, 3), (2, 3), (2, 2), (2, 1)]
```

Get the edges from this sequence of nodes:

```
In [ ]: zip(path[1:], path[:-1])
```

```
Out[ ]: <zip at 0xffff4bfd4d00>
```

```
In [ ]: edges = list(zip(path[1:], path[:-1]))
for a, b in edges:
    print('edge from %s to %s' % (a, b))
```

```
edge from (2, 3) to (1, 3)
edge from (2, 2) to (2, 3)
edge from (2, 1) to (2, 2)
```

We can recover the relative pose using `get_edge_data` :

```
In [ ]: deltas = []
        for a, b in edges:
            R = M.get_edge_data(a, b)[0]['relative_pose']
            deltas.append(R)
            print('edge %s to %s: relative pose: %s' % (a, b, geo.SE2.friendly(R)))
        print(deltas)
```

```
edge (2, 3) to (1, 3): relative pose: Pose(Rot(0.0deg), [-0.61  0.  ])
edge (2, 2) to (2, 3): relative pose: Pose(Rot(0.0deg), [0.  0.61])
edge (2, 1) to (2, 2): relative pose: Pose(Rot(0.0deg), [0.  0.61])
[array([[ 1.  ,  0.  , -0.61],
        [ 0.  ,  1.  ,  0.  ],
        [ 0.  ,  0.  ,  1.  ]]), array([[1.  ,  0.  ,  0.  ],
        [0.  ,  1.  ,  0.61],
        [0.  ,  0.  ,  1.  ]]), array([[1.  ,  0.  ,  0.  ],
        [0.  ,  1.  ,  0.61],
        [0.  ,  0.  ,  1.  ]])]
```

```
In [ ]: def multiply_deltas(G, deltas):
        S = geo.SE2.identity()
        for R in deltas:
            S = geo.SE2.multiply(S, R) # multiply on the right
        return S
```

```
In [ ]: S = multiply_deltas(M, deltas)
        print(geo.SE2.friendly(S))
```

```
Pose(Rot(0.0deg), [-0.61  1.22])
```

Now proceed to the [planning exercise](#).