

python-igraph tutorial

- <https://igraph.org/python/doc/tutorial/tutorial.html> (<https://igraph.org/python/doc/tutorial/tutorial.html>)
- [STATS701: Data Analysis in Python](https://pages.stat.wisc.edu/~kdlevin/teaching/Winter2018/STATS701/) (<https://pages.stat.wisc.edu/~kdlevin/teaching/Winter2018/STATS701/>) - <https://pages.stat.wisc.edu/~kdlevin/teaching/Winter2018/STATS701/> (<https://pages.stat.wisc.edu/~kdlevin/teaching/Winter2018/STATS701/>)
 - Lecture 27 - Graph processing - <https://pages.stat.wisc.edu/~kdlevin/teaching/Winter2018/STATS701/slides/lecture27.pdf> (<https://pages.stat.wisc.edu/~kdlevin/teaching/Winter2018/STATS701/slides/lecture27.pdf>)

1 How to create graph

1.1 Create a simple graph

```
In [1]: ▶ 1 import igraph as ig  
        2 print(ig.__version__)
```

0.9.6



```
In [188]: 1 def default_visual_style(g, visual_style={}):
2         if not "vertex_size" in visual_style:
3             visual_style["vertex_size"] = 20
4
5         if not "vertex_color" in visual_style:
6             visual_style["vertex_color"] = "green"
7
8         if not "bbox" in visual_style:
9             visual_style["bbox"] = (300, 300)
10
11        if not "margin" in visual_style:
12            visual_style["margin"] = 20
13
14        if not "vertex_label" in visual_style:
15            if "name" in g.vs.attributes():
16                g.vs["label"] = g.vs["name"]
17            elif "id" in g.vs.attributes():
18                g.vs["label"] = g.vs["id"]
19            elif "label" in g.vs.attributes():
20                pass
21            else:
22                g.vs["label"] = [str(i) for i in range(len(g.vs))]
23            visual_style["vertex_label"] = g.vs["label"]
24        return visual_style
```

```
In [29]: 1 g = ig.Graph()
```

```
In [30]: 1 g.add_vertices(3)
2
3 g.add_edges([(0,1), (1,2)])
4
5 print(g)
```

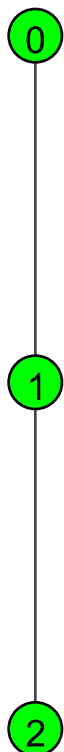
```
IGRAPH U--- 3 2 --
+ edges:
0--1 1--2
```

```
In [31]: 1 len(g.vs), len(g.es), list(g.vs), list(g.es)
```

```
Out[31]: (3,  
2,  
[igraph.Vertex(<igraph.Graph object at 0x000001F3F760BB88>, 0, {}),  
igraph.Vertex(<igraph.Graph object at 0x000001F3F760BB88>, 1, {}),  
igraph.Vertex(<igraph.Graph object at 0x000001F3F760BB88>, 2, {})],  
[igraph.Edge(<igraph.Graph object at 0x000001F3F760BB88>, 0, {}),  
igraph.Edge(<igraph.Graph object at 0x000001F3F760BB88>, 1, {})])
```

```
In [32]: 1 ig.plot(g, layout=g.layout("tree", root=[0]), **default_visual_style(g))
```

Out[32]:



```
In [33]: 1 g.add_vertices(3)  
2 g.add_edges([(2, 3), (3, 4), (4, 5), (5, 3)])
```

In [34]: 1 `print(g)`

```
IGRAPH U--- 6 6 --  
+ attr: label (v)  
+ edges:  
0--1 1--2 2--3 3--4 4--5 3--5
```

In [35]: 1 `g.summary()` *# ignore edges*

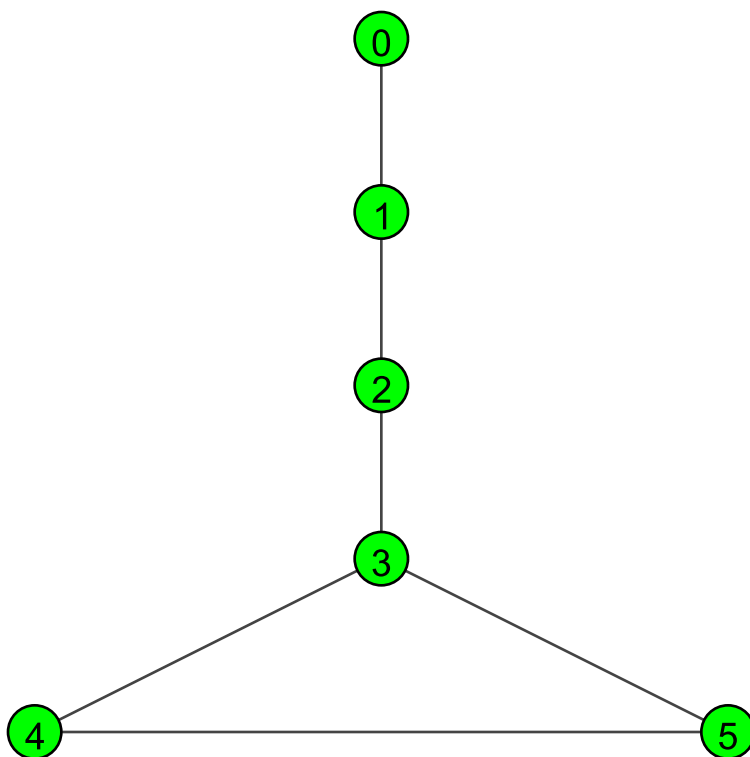
Out[35]: 'IGRAPH U--- 6 6 -- \n+ attr: label (v)'

In [36]: 1 `g.get_eid(2, 3), g.get_eid(3, 5)`

Out[36]: (2, 5)

```
In [37]: 1 ig.plot(g, layout=g.layout("tree", root=[0]), **default_visual_style(g))
```

Out[37]:



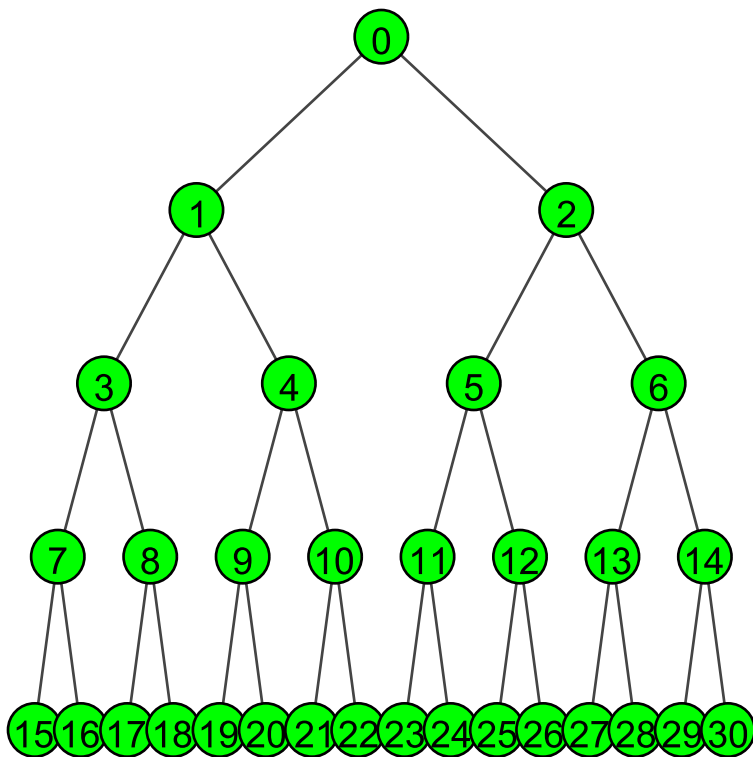
1.2 Create a Tree graph

```
In [38]: 1 import math
2
3 # complete binary tree
4 depth = 5
5 breadth = 2
6 n_vs = 0
7 for d in range(depth):
8     n_vs += math.pow(breadth, d)
9 n_vs = int(n_vs)
10 print(f"No. of nodes: {n_vs}")
```

No. of nodes: 31

```
In [39]: 1 gt = ig.Graph.Tree(n_vs,breadth)
2 ig.plot(gt, layout=gt.layout("tree", root=[0]), **default_visual_style(gt))
```

Out[39]:



In [40]: 1 `print(gt)`

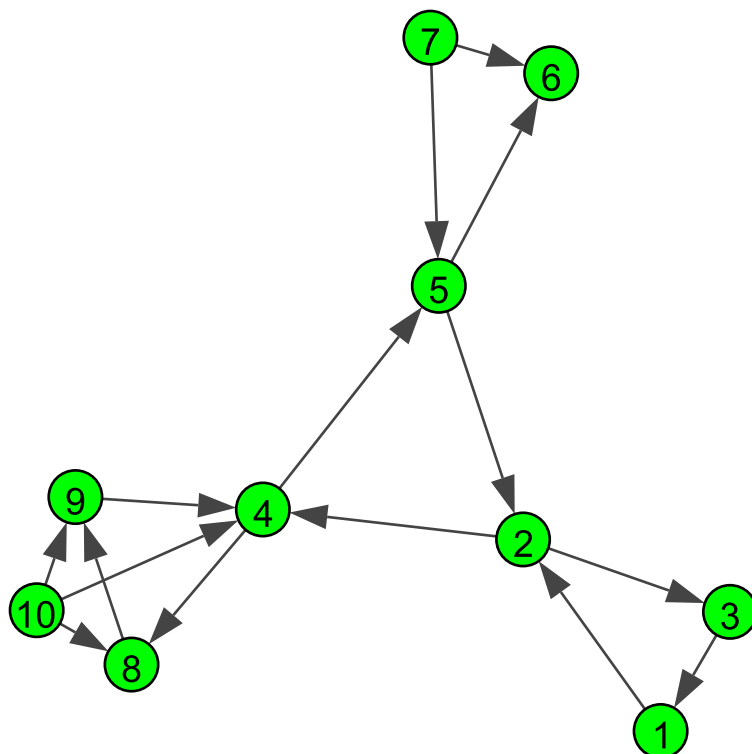
```
IGRAPH U--- 31 30 --
+ attr: label (v)
+ edges:
0--1 0--2 1--3 1--4 2--5 2--6 3--7 3--8 4--9 4--10 5--11 5--12 6--13 6--14
7--15 7--16 8--17 8--18 9--19 9--20 10--21 10--22 11--23 11--24 12--25 12--26
13--27 13--28 14--29 14--30
```

1.3 create graph from text file

In [42]: 1 `small_net = """`
2 `1 2`
3 `2 3`
4 `2 7`
5 `3 1`
6 `4 2`
7 `4 6`
8 `5 4`
9 `5 6`
10 `7 4`
11 `7 8`
12 `8 9`
13 `9 7`
14 `10 7`
15 `10 8`
16 `10 9`
17 `"""`
18
19 `with open("net.txt", "w") as f:`
20 `f.write(small_net)`

```
In [45]: 1 g1 = ig.Graph.Read_Ncol("net.txt")
2 g1.vs["label"] = [str(i+1) for i in range(len(g1.vs))]
3 ig.plot(g1, **default_visual_style(g1))
```

Out[45]:



1.4 generates a geometric random graph

n points are chosen randomly and uniformly inside the unit square and pairs of points closer to each other than a predefined distance d are connected by an edge

```
In [153]: 1 gr = ig.Graph.GRG(50, 0.2)
```

```
In [154]: 1 gr.summary()
```

Out[154]: 'IGRAPH U--- 50 125 -- \n+ attr: x (v), y (v)'

In [155]: 1 print(gr)

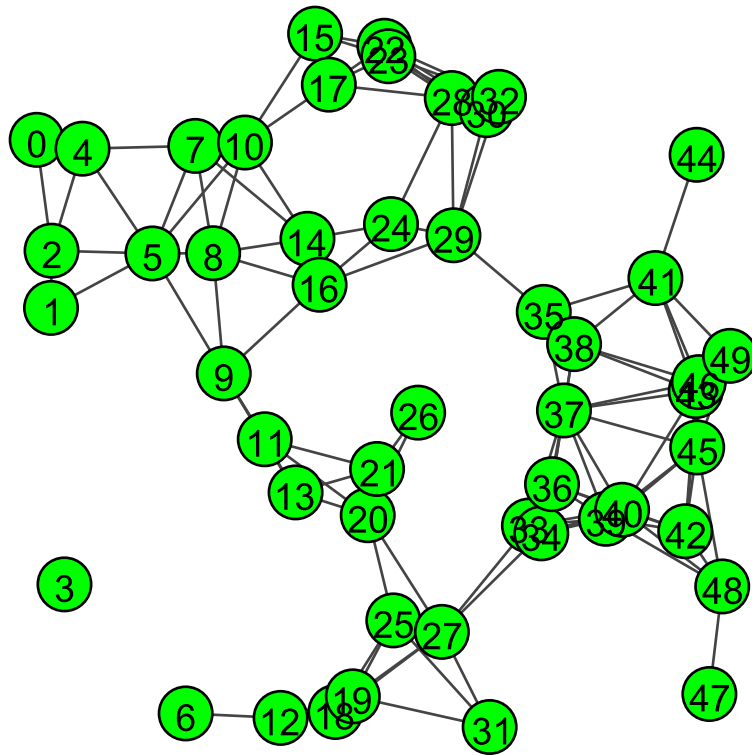
```

IGRAPH U--- 50 125 --
+ attr: x (v), y (v)
+ edges:
  0 -- 2 4 24 -- 14 16 28 29 48
-- 39 40 42 45 47
  1 -- 2 5 25 -- 18 19 20 27 31 49
-- 41 43 45 46
  2 -- 0 1 4 5 26 -- 20 21
  3 -- 27 -- 18 19 20 25 31 33 34
  4 -- 0 2 5 7 28 -- 17 22 23 24 29 30 32
  5 -- 1 2 4 7 8 9 10 29 -- 16 24 28 30 32 35
  6 -- 12 30 -- 22 23 28 29 32
  7 -- 4 5 8 10 14 31 -- 19 25 27
  8 -- 5 7 9 10 14 16 32 -- 22 23 28 29 30
  9 -- 5 8 11 13 16 33 -- 27 34 36 37 39 40
10 -- 5 7 8 14 15 17 34 -- 27 33 36 37 39 40
11 -- 9 13 20 21 35 -- 29 37 38 41
12 -- 6 18 19 36 -- 33 34 37 38 39 40 42
13 -- 9 11 20 21 37 -- 33 34 35 36 38 39 40 43 45 46
14 -- 7 8 10 16 24 38 -- 35 36 37 41 43 46
15 -- 10 17 22 23 39 -- 33 34 36 37 40 42 45 48
16 -- 8 9 14 24 29 40 -- 33 34 36 37 39 42 43 45 48
17 -- 10 15 22 23 28 41 -- 35 38 43 44 46 49
18 -- 12 19 25 27 42 -- 36 39 40 43 45 46 48
19 -- 12 18 25 27 31 43 -- 37 38 40 41 42 45 46 49
20 -- 11 13 21 25 26 27 44 -- 41
21 -- 11 13 20 26 45 -- 37 39 40 42 43 46 48 49
22 -- 15 17 23 28 30 32 46 -- 37 38 41 42 43 45 49
23 -- 15 17 22 28 30 32 47 -- 48

```

```
In [158]: 1 ig.plot(gr, **default_visual_style(gr, {}))
```

Out[158]:

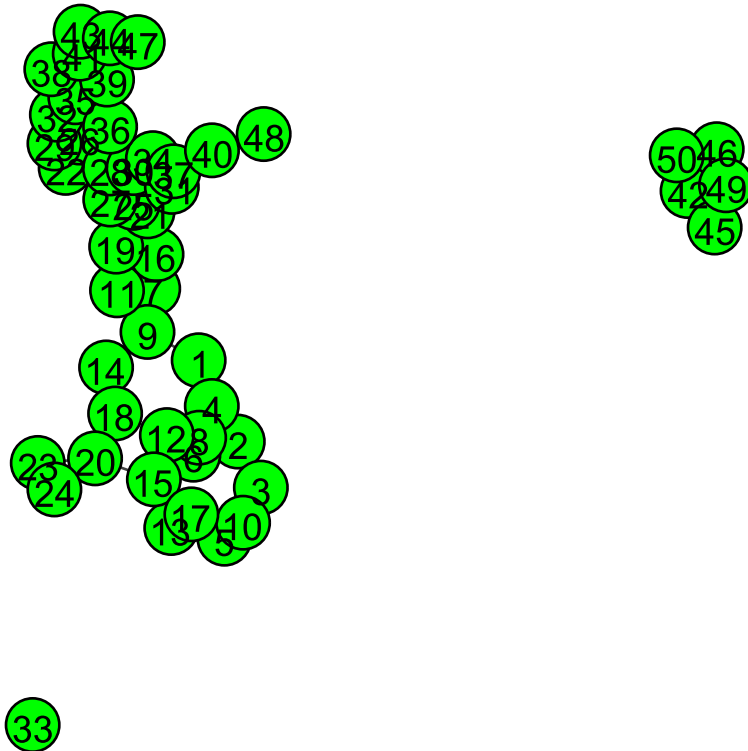


1.4.1 Various layout

In [127]:

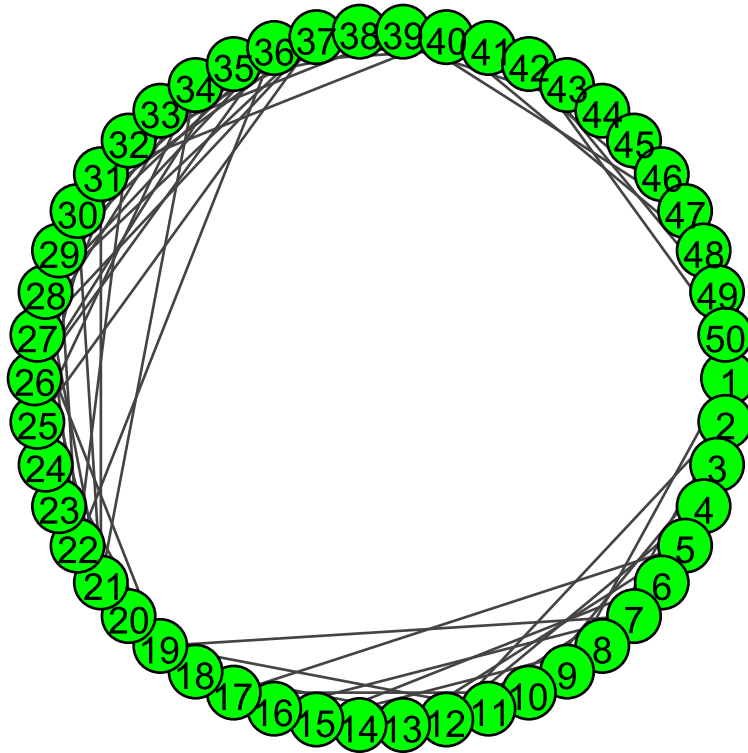
```
1 # Kamada-Kawai force-directed algorithm
2 ig.plot(gr, layout=gr.layout("kk"), **default_visual_style(gr, {}))
```

Out[127]:



```
In [128]: 1 # Deterministic layout that places the vertices on a circle  
2 ig.plot(gr, layout=gr.layout("circle"), **default_visual_style(gr, {}))
```

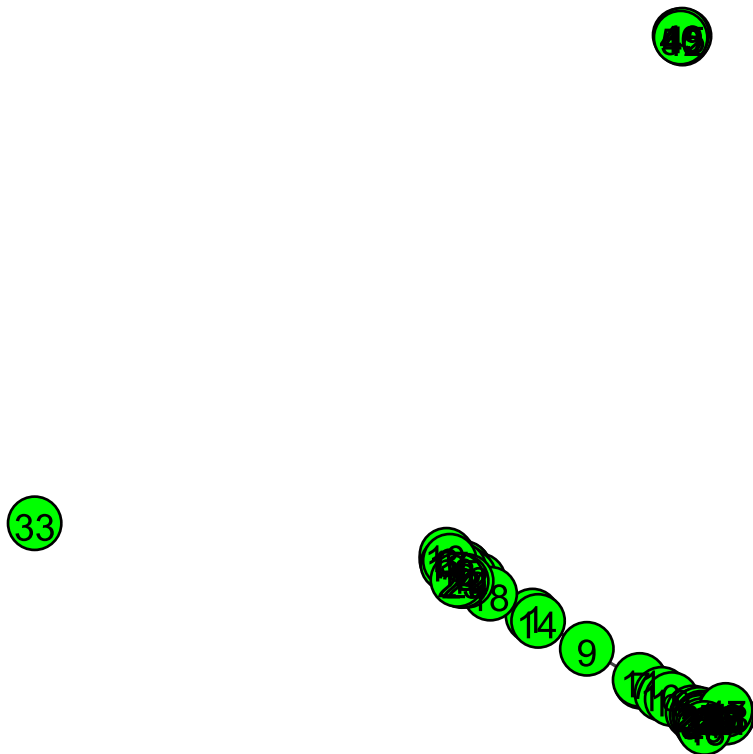
Out[128]:



In [129]:

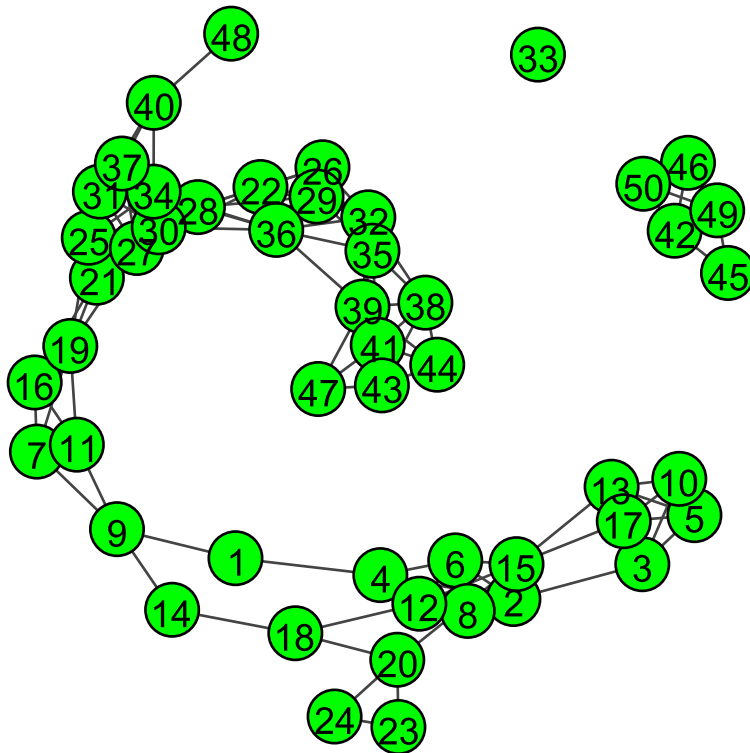
```
1 # The Distributed Recursive Layout algorithm for Large graphs
2 ig.plot(gr, layout=gr.layout("dr1"), **default_visual_style(gr, {}))
```

Out[129]:



```
In [130]: 1 # Fruchterman-Reingold force-directed algorithm  
2 ig.plot(gr, layout=gr.layout("fr"), **default_visual_style(gr, {}))
```

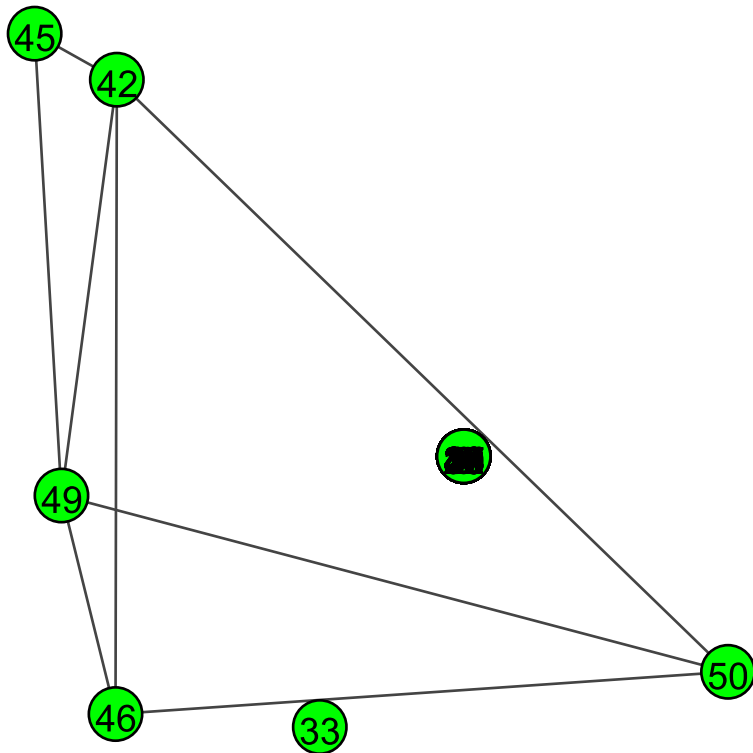
Out[130]:



In [131]:

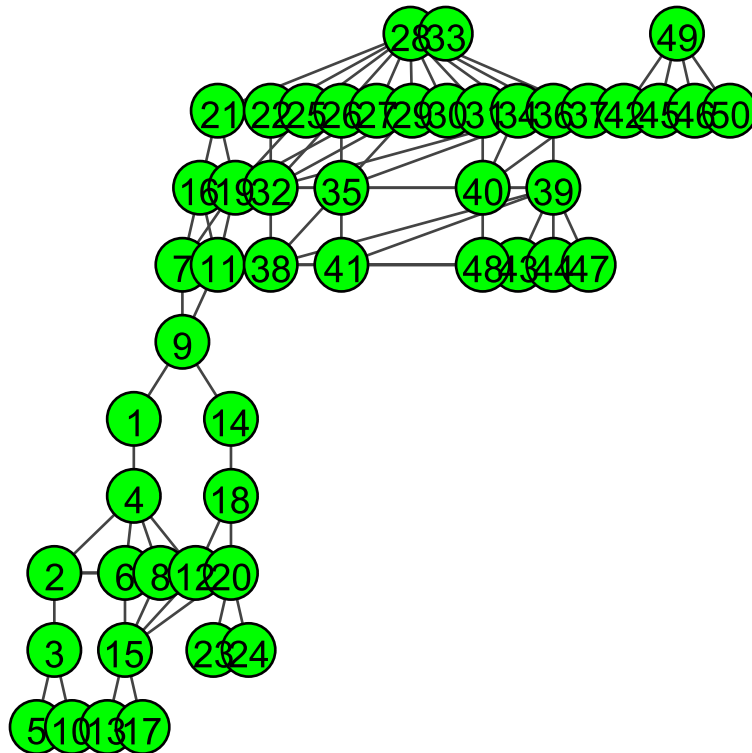
```
1 # The Large Graph Layout algorithm for large graphs
2 ig.plot(gr, layout=gr.layout("large"), **default_visual_style(gr, {}))
```

Out[131]:



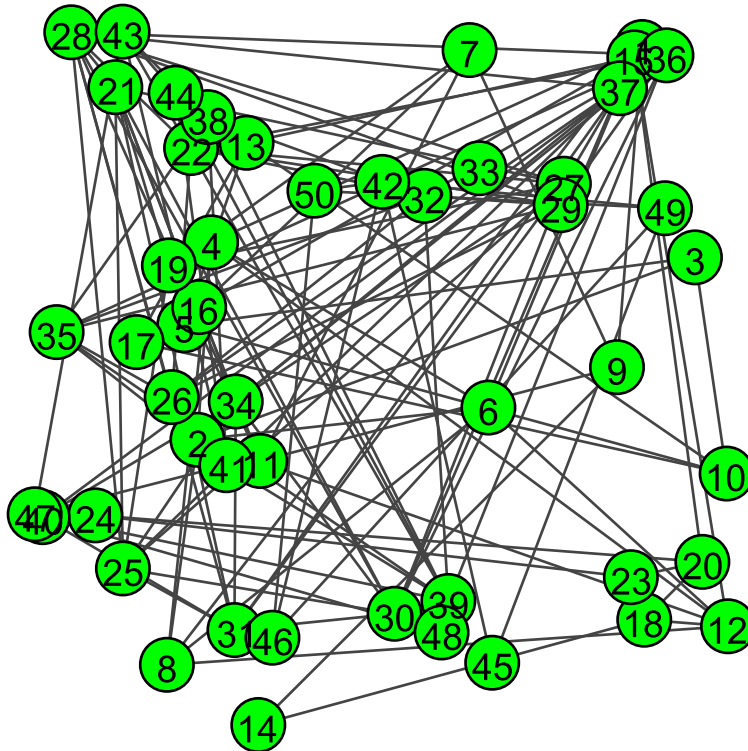
```
In [132]: 1 # Reingold-Tilford tree layout, useful for (almost) tree-like graphs
          2 ig.plot(gr, layout=gr.layout("tree"), **default_visual_style(gr, {}))
```

Out[132]:




```
In [133]: 1 # Places the vertices completely randomly
          2 ig.plot(gr, layout=gr.layout("random"), **default_visual_style(gr, {}))
```

Out[133]:



2 Setting and retrieving attributes

igraph uses vertex and edge IDs in its core. These IDs are integers, starting from zero, and they are always continuous at any given time instance during the lifetime of the graph. This means that whenever vertices and edges are deleted, a large set of edge and possibly vertex IDs will be renumbered to ensure the continuity. Now, let us assume that our graph is a social network where vertices represent people and edges represent social connections between them. One way to maintain the association between vertex IDs and say, the corresponding names is to have an additional Python list that maps from vertex IDs to names. The drawback of this approach is that this additional list must be maintained in parallel to the modifications of the original graph.

Luckily, igraph knows the concept of attributes, i.e., auxiliary objects associated to a given vertex or edge of a graph, or even to the graph as a whole.

Every igraph Graph, vertex and edge behaves as a standard Python dictionary in some sense: you can add key-value pairs to any of them, with the key representing the name of your attribute (the only restriction is that it must be a string) and the value representing the attribute itself.

```
In [51]: 1 g3 = ig.Graph([(0,1), (0,2), (2,3), (3,4), (4,2), (2,5), (5,0), (6,3), (5,6)])
```

```
In [52]: 1 print(g3)
```

```
IGRAPH U--- 7 9 --
+ edges:
0 -- 1 2 5      2 -- 0 3 4 5      4 -- 2 3      6 -- 3 5
1 -- 0          3 -- 2 4 6      5 -- 0 2 6
```

Every Graph object contains two special members called **vs** (vertex sequence) and **es** (edge sequence)

```
In [73]: 1 g3.vs["name"] = ["Alice", "Bob", "Claire", "Dennis", "Esther", "Frank", "George"]
2 g3.vs["age"] = [25, 31, 18, 47, 22, 23, 50]
3 g3.vs["gender"] = ["f", "m", "f", "m", "f", "m", "m"]
4 g3.es["is_formal"] = [False, False, True, True, True, False, True, False, False]
```

```
In [74]: 1 print(g3)
```

```
IGRAPH UN-- 7 9 --
+ attr: age (v), gender (v), label (v), name (v), is_formal (e)
+ edges (vertex names):
  Alice -- Bob, Claire, Frank      Esther -- Claire, Dennis
    Bob -- Alice                  Frank -- Alice, Claire, George
  Claire -- Alice, Dennis, Esther, Frank  George -- Dennis, Frank
  Dennis -- Claire, Esther, George
```

```
In [75]: 1 g3.summary()
```

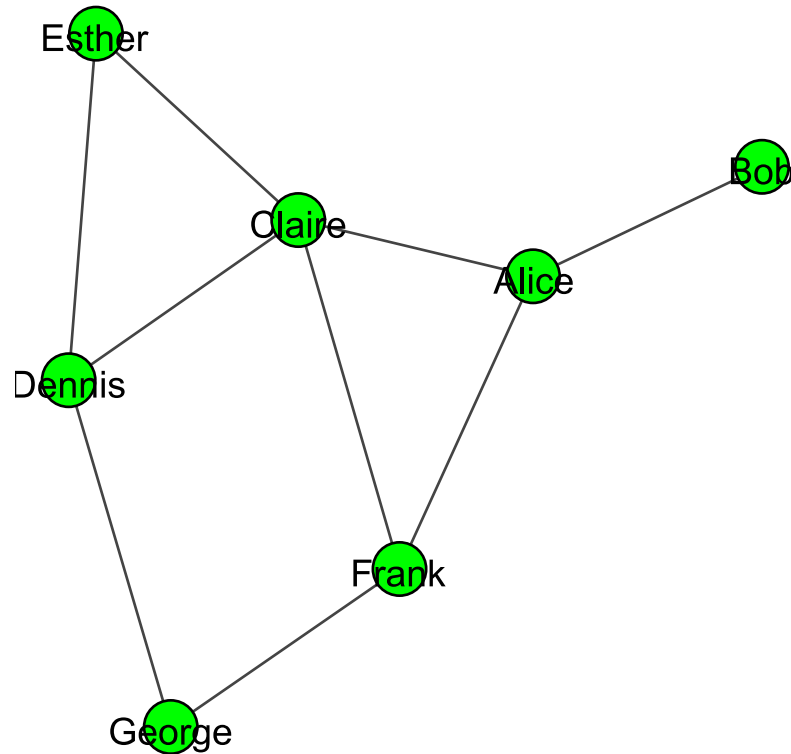
```
Out[75]: 'IGRAPH UN-- 7 9 -- \n+ attr: age (v), gender (v), label (v), name (v), is_formal (e)'
```

```
In [76]: 1 g3.vs["name"]
```

```
Out[76]: ['Alice', 'Bob', 'Claire', 'Dennis', 'Esther', 'Frank', 'George']
```

```
In [79]: 1 ig.plot(g3, **default_visual_style(g3))
```

Out[79]:



```
In [56]: 1 g3.es[0].attributes()
```

Out[56]: {'is_formal': False}

```
In [57]: 1 g3.es[0].attributes()["is_formal"]
```

Out[57]: False

```
In [58]: 1 g3.vs[3].attributes()
```

Out[58]: {'name': 'Dennis', 'age': 47, 'gender': 'm'}

```
In [59]: 1 g3.vs[3]
```

```
Out[59]: igraph.Vertex(<igraph.Graph object at 0x000001F3F7853408>, 3, {'name': 'Dennis', 'age': 47, 'gender': 'm'})
```

```
In [60]: 1 list(g3.vs)
```

```
Out[60]: [igraph.Vertex(<igraph.Graph object at 0x000001F3F7853408>, 0, {'name': 'Alice', 'age': 25, 'gender': 'f'}),  
          igraph.Vertex(<igraph.Graph object at 0x000001F3F7853408>, 1, {'name': 'Bob', 'age': 31, 'gender': 'm'}),  
          igraph.Vertex(<igraph.Graph object at 0x000001F3F7853408>, 2, {'name': 'Claire', 'age': 18, 'gender': 'f'}),  
          igraph.Vertex(<igraph.Graph object at 0x000001F3F7853408>, 3, {'name': 'Dennis', 'age': 47, 'gender': 'm'}),  
          igraph.Vertex(<igraph.Graph object at 0x000001F3F7853408>, 4, {'name': 'Esther', 'age': 22, 'gender': 'f'}),  
          igraph.Vertex(<igraph.Graph object at 0x000001F3F7853408>, 5, {'name': 'Frank', 'age': 23, 'gender': 'm'}),  
          igraph.Vertex(<igraph.Graph object at 0x000001F3F7853408>, 6, {'name': 'George', 'age': 50, 'gender': 'm'})]
```

```
In [61]: 1 list(g3.es)
```

```
Out[61]: [igraph.Edge(<igraph.Graph object at 0x000001F3F7853408>, 0, {'is_formal': False}),  
          igraph.Edge(<igraph.Graph object at 0x000001F3F7853408>, 1, {'is_formal': False}),  
          igraph.Edge(<igraph.Graph object at 0x000001F3F7853408>, 2, {'is_formal': True}),  
          igraph.Edge(<igraph.Graph object at 0x000001F3F7853408>, 3, {'is_formal': True}),  
          igraph.Edge(<igraph.Graph object at 0x000001F3F7853408>, 4, {'is_formal': True}),  
          igraph.Edge(<igraph.Graph object at 0x000001F3F7853408>, 5, {'is_formal': False}),  
          igraph.Edge(<igraph.Graph object at 0x000001F3F7853408>, 6, {'is_formal': True}),  
          igraph.Edge(<igraph.Graph object at 0x000001F3F7853408>, 7, {'is_formal': False}),  
          igraph.Edge(<igraph.Graph object at 0x000001F3F7853408>, 8, {'is_formal': False})]
```

2.1 graph properties

```
In [128]: 1 g3.degree()
```

```
Out[128]: [3, 1, 4, 3, 2, 3, 2]
```

```
In [129]: 1 g3.degree(6)  # degree for vortexID=6
```

```
Out[129]: 2
```

```
In [130]: 1 g3.degree([2,3])
```

```
Out[130]: [4, 3]
```

```
In [131]: 1 g3.vs.select(_degree=g3.maxdegree())["name"]
```

```
Out[131]: ['Claire']
```

```
In [83]: 1 list(g3.es.select(_source=2))
```

```
Out[83]: [igraph.Edge(<igraph.Graph object at 0x000001F3F7853408>, 1, {'is_formal': False}),  
          igraph.Edge(<igraph.Graph object at 0x000001F3F7853408>, 2, {'is_formal': True}),  
          igraph.Edge(<igraph.Graph object at 0x000001F3F7853408>, 4, {'is_formal': True}),  
          igraph.Edge(<igraph.Graph object at 0x000001F3F7853408>, 5, {'is_formal': False})]
```

```
In [82]: 1 list(g3.es.select(_target=0))
```

```
Out[82]: [igraph.Edge(<igraph.Graph object at 0x000001F3F7853408>, 0, {'is_formal': False}),  
          igraph.Edge(<igraph.Graph object at 0x000001F3F7853408>, 1, {'is_formal': False}),  
          igraph.Edge(<igraph.Graph object at 0x000001F3F7853408>, 6, {'is_formal': True})]
```

```
In [133]: 1 for e in g3.es.select(_within=g3.vs[2:5]):  
          2     print(e)
```

```
igraph.Edge(<igraph.Graph object at 0x00000144B4EDF318>, 2, {'is_formal': True})  
igraph.Edge(<igraph.Graph object at 0x00000144B4EDF318>, 3, {'is_formal': True})  
igraph.Edge(<igraph.Graph object at 0x00000144B4EDF318>, 4, {'is_formal': True})
```

In [134]:

```
1 for v in g3.vs.select(gender="m"):
2     print(v)
```

```
igraph.Vertex(<igraph.Graph object at 0x00000144B4EDF318>, 1, {'name': 'Bob', 'age': 31, 'gender': 'm'})
igraph.Vertex(<igraph.Graph object at 0x00000144B4EDF318>, 3, {'name': 'Dennis', 'age': 47, 'gender': 'm'})
igraph.Vertex(<igraph.Graph object at 0x00000144B4EDF318>, 5, {'name': 'Frank', 'age': 23, 'gender': 'm'})
igraph.Vertex(<igraph.Graph object at 0x00000144B4EDF318>, 6, {'name': 'George', 'age': 50, 'gender': 'm'})
```

In [135]:

```
1 men = g3.vs.select(gender="m")
2 women = g3.vs.select(gender="f")
3 for e in g3.es.select(_between=(men, women)):
4     print(e)
```

```
igraph.Edge(<igraph.Graph object at 0x00000144B4EDF318>, 0, {'is_formal': False})
igraph.Edge(<igraph.Graph object at 0x00000144B4EDF318>, 2, {'is_formal': True})
igraph.Edge(<igraph.Graph object at 0x00000144B4EDF318>, 3, {'is_formal': True})
igraph.Edge(<igraph.Graph object at 0x00000144B4EDF318>, 5, {'is_formal': False})
igraph.Edge(<igraph.Graph object at 0x00000144B4EDF318>, 6, {'is_formal': True})
```

In [136]:

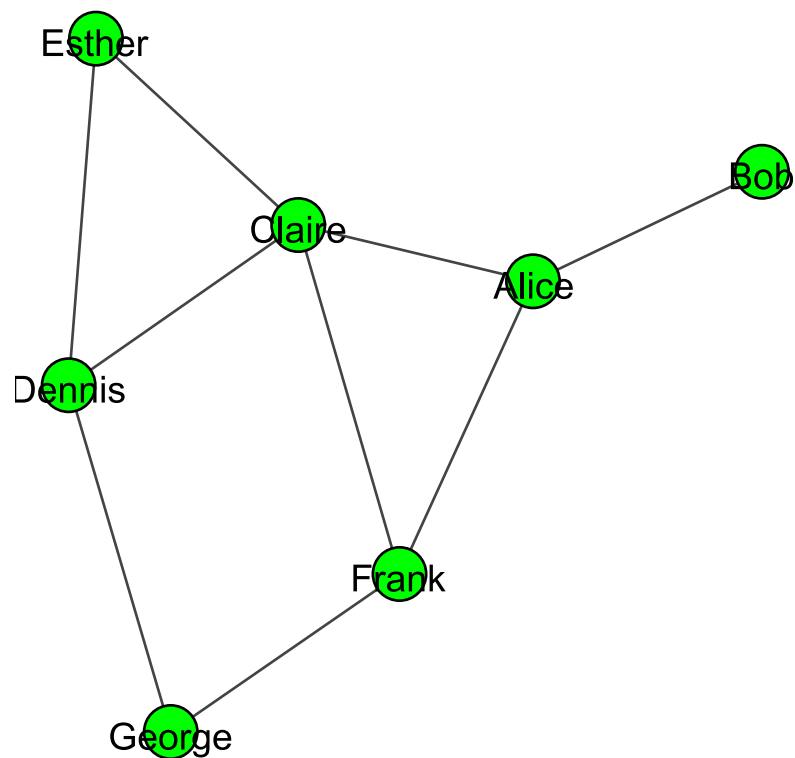
```
1 g3.get_adjacency()
```

Out[136]: Matrix([[0, 1, 1, 0, 0, 1, 0], [1, 0, 0, 0, 0, 0, 0], [1, 0, 0, 1, 1, 1, 0], [0, 0, 1, 0, 1, 0, 1], [0, 0, 1, 1, 0, 0, 0], [1, 0, 1, 0, 0, 0, 1], [0, 0, 0, 1, 0, 1, 0]])

2.1.1 Plot layout

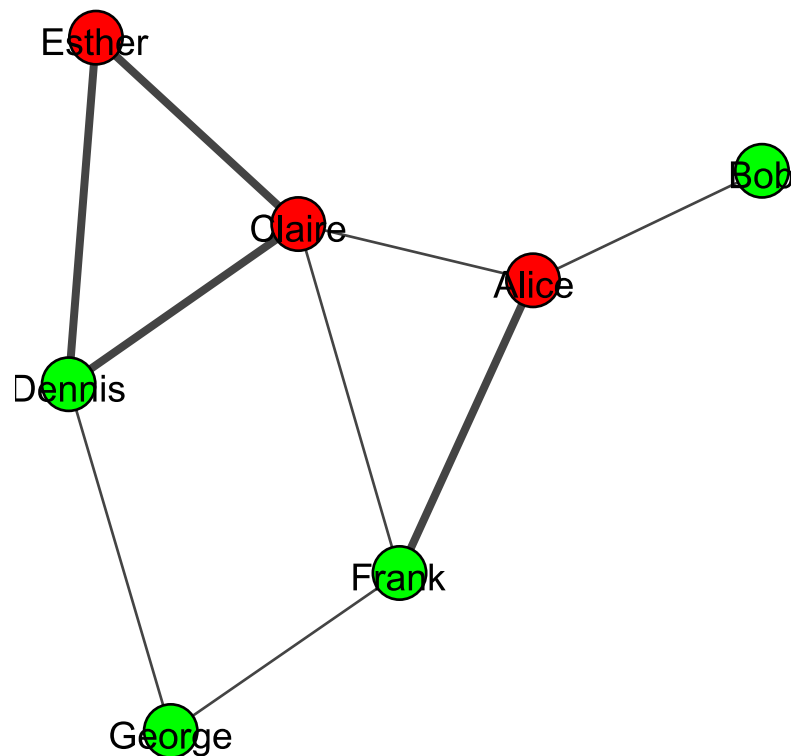
```
In [93]: 1 ig.plot(g3, layout=g3.layout("kk"), **default_visual_style(g3))
```

Out[93]:



```
In [95]: 1 # customize vertex_color, edge_width
2
3 # g3.vs["label"] = g3.vs["name"]
4 color_dict = {"m": "green", "f": "red"}
5 visual_style["edge_width"] = [1 + 2 * int(is_formal) for is_formal in g3.es["is_formal"]]
6 g3.vs["color"] = [color_dict[gender] for gender in g3.vs["gender"]]
7 visual_style["vertex_color"] = g3.vs["color"]
8 ig.plot(g3, layout=g3.layout("kk"), **default_visual_style(g3, visual_style))
```

Out[95]:



In []: 1

2.2 persist graph

In [96]: 1 g3.save("soc_net.gml", format="gml")

```
c:\work\github\nlp\textnets\lib\site-packages\igraph\__init__.py:2984: RuntimeWarning: A boolean edge attribute was converted to numeric at src/io/gml.c:763
  return writer(f, *args, **kwds)
```

In [97]: 1 !dir soc_net.gml

```
Volume in drive C is CDRIVE
Volume Serial Number is F0EF-6714
```

```
Directory of C:\work\github\NLP\textnets-tutorial
```

```
09/28/2021  10:12 AM           1,312 soc_net.gml
             1 File(s)             1,312 bytes
             0 Dir(s)  82,459,770,880 bytes free
```

In [98]: 1 !type soc_net.gml

```
source 2
target 0
isformal 0
]
edge
[
  source 3
  target 2
  isformal 1
]
edge
[
  source 4
  target 3
  isformal 1
]
edge
[
  source 4
  target 2
  isformal 1
]
```

In [99]: 1 g3_2 = ig.load("soc_net.gml")

In [100]: 1 print(g3_2)

```
IGRAPH UN-- 7 9 --
+ attr: age (v), color (v), gender (v), id (v), label (v), name (v), isformal
(e)
+ edges (vertex names):
  Alice -- Bob, Claire, Frank          Esther -- Claire, Dennis
    Bob -- Alice                      Frank -- Alice, Claire, George
  Claire -- Alice, Dennis, Esther, Frank George -- Dennis, Frank
  Dennis -- Claire, Esther, George
```

In [101]: 1 print(g3)

```
IGRAPH UN-- 7 9 --
+ attr: age (v), color (v), gender (v), label (v), name (v), is_formal (e)
+ edges (vertex names):
  Alice -- Bob, Claire, Frank          Esther -- Claire, Dennis
    Bob -- Alice                      Frank -- Alice, Claire, George
  Claire -- Alice, Dennis, Esther, Frank George -- Dennis, Frank
  Dennis -- Claire, Esther, George
```

In [102]: 1 g3_2.isomorphic(g3)

Out[102]: True

2.3 Integration

In [152]: 1 karate = ig.Graph.Read_GraphML("zachary.graphml")

In [153]: 1 karate.summary()

Out[153]: 'IGRAPH U--- 34 78 -- \n+ attr: id (v)'

```
In [154]: 1 layout = karate.layout("kk")
          2 visual_style = {}
          3 visual_style["vertex_label"] = karate.vs["id"]
          4 ig.plot(karate, layout=layout, **visual_style)
```

Out[154]: <igraph.drawing.Plot at 0x144b49d85f8>

```
In [175]: 1 layout = karate.layout("fr")
          2 visual_style = {}
          3 visual_style["vertex_label"] = karate.vs["id"]
          4 ig.plot(karate, layout=layout, **visual_style)
```

Out[175]: <igraph.drawing.Plot at 0x144b4e34320>

```
In [176]: 1 layout = karate.layout("tree")
          2 visual_style = {}
          3 visual_style["vertex_label"] = karate.vs["id"]
          4 ig.plot(karate, layout=layout, **visual_style)
```

Out[176]: <igraph.drawing.Plot at 0x144b47198d0>

2.4 Measures, coefficients, transformations

```
In [160]: 1 karate.density()
```

Out[160]: 0.13903743315508021

```
In [161]: 1 karate.diameter()
```

Out[161]: 5

```
In [162]: 1 d = karate.indegree()
```

```
In [164]: 1 print(d)
```

[16, 9, 10, 6, 3, 4, 4, 4, 5, 2, 3, 1, 2, 5, 2, 2, 2, 2, 2, 3, 2, 2, 2, 5, 3, 3, 2, 4, 3, 4, 4, 6, 12, 17]

In [165]: `1 b = karate.betweenness()`

In [166]: `1 print(b)`

```
[231.0714285714286, 28.478571428571424, 75.85079365079366, 6.288095238095237, 0.3333333333333333, 15.833333333333334, 15.833333333333332, 0.0, 29.529365079365082, 0.44761904761904764, 0.3333333333333333, 0.0, 0.0, 24.215873015873015, 0.0, 0.0, 0.0, 0.0, 0.0, 17.1468253968254, 0.0, 0.0, 0.0, 9.299999999999999, 1.1666666666666665, 2.0277777777777777, 0.0, 11.79206349206349, 0.9476190476190476, 1.5428571428571427, 7.60952380952381, 73.00952380952378, 76.69047619047619, 160.5515873015873]
```

In [167]: `1 len(karate.vs), len(d), len(b)`

Out[167]: (34, 34, 34)

2.4.1 sort nodes by betweenness

In [174]: `1 karate.vs['between']=b
2 karate.vs["name"] = karate.vs["id"]
3
4 m=sorted(karate.vs, key=lambda z: z['between'], reverse=True)
5 for e in m[:10]:
6 print(f"name: {e['name']}, betweenness: {e['between']}")`

```
name: n0, betweenness: 231.0714285714286  
name: n33, betweenness: 160.5515873015873  
name: n32, betweenness: 76.69047619047619  
name: n2, betweenness: 75.85079365079366  
name: n31, betweenness: 73.00952380952378  
name: n8, betweenness: 29.529365079365082  
name: n1, betweenness: 28.478571428571424  
name: n13, betweenness: 24.215873015873015  
name: n19, betweenness: 17.1468253968254  
name: n5, betweenness: 15.833333333333334
```

2.5 community detection

In [177]: `C=karate.community_infomap()`

In [178]: `print(C)`

Clustering with 34 elements and 3 clusters

[0] n0, n1, n2, n3, n7, n9, n11, n12, n13, n17, n19, n21

[1] n4, n5, n6, n10, n16

[2] n8, n14, n15, n18, n20, n22, n23, n24, n25, n26, n27, n28, n29, n30, n31,
n32, n33

In [184]: `type(C[1]), C[1]`

Out[184]: (list, [4, 5, 6, 10, 16])

```
1 for v in karate.vs:
2     n = v["id"].replace("n","")
3     if int(n) in C[1]:
4         print("In C1")
5     else:
6         print("out")
7
```

```
In [192]: 1 ID_COMM = 2
2 karate.vs["label"] = karate.vs["id"]
3 comm_color = []
4 for v in karate.vs:
5     if int(v["id"].replace("n","")) in C[ID_COMM]:
6         comm_color.append("green")
7     else:
8         comm_color.append("red")
9
10 visual_style["vertex_color"] = comm_color
11 ig.plot(karate, layout=karate.layout("kk"), **visual_style)
```

Out[192]: <igraph.drawing.Plot at 0x144b4e34518>

2.5.1 detect community in a random graph

In [159]: `C2=gr.community_infomap()`

In [160]: `for n, g in enumerate(C2):
print(f"n={n}, g={g}")`

`n=0, g=[0, 1, 2, 4, 5, 7, 8, 9, 10, 14, 16]`

`n=1, g=[3]`

`n=2, g=[6, 12, 18, 19, 25, 27, 31]`

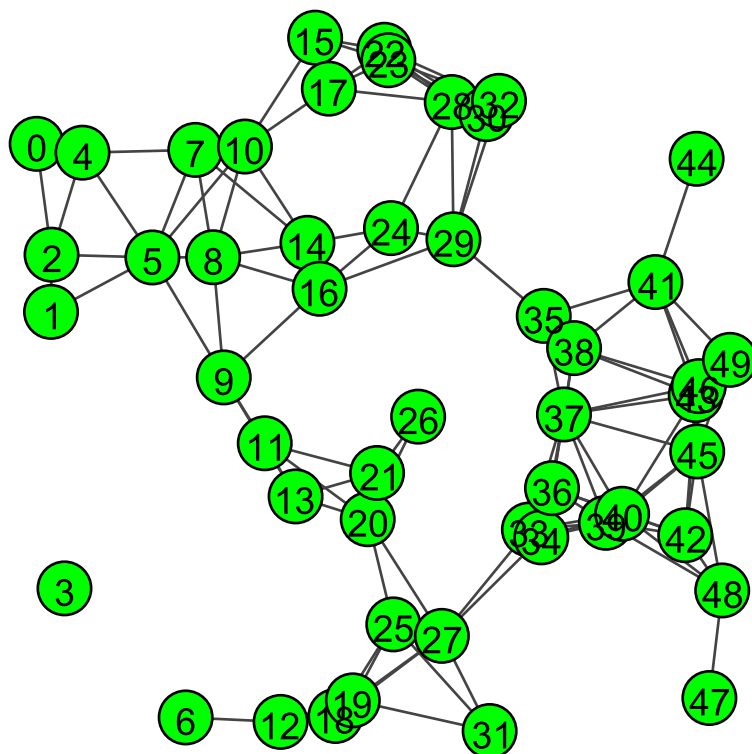
`n=3, g=[11, 13, 20, 21, 26]`

`n=4, g=[15, 17, 22, 23, 24, 28, 29, 30, 32]`

`n=5, g=[33, 34, 35, 36, 37, 38, 39, 40, 41, 42, 43, 44, 45, 46, 47, 48, 49]`

In [161]: `ig.plot(gr, **default_visual_style(gr, {}))`

Out[161]:



In [179]: `g_c0 = C2.subgraph(0)`

In [180]: `print(g_c0)`

```
IGRAPH U--- 11 22 --
+ attr: label (v), x (v), y (v)
+ edges:
 0 -- 2 3          4 -- 1 2 3 5 6 7 8    8 -- 4 5 6 9
 1 -- 2 4          5 -- 3 4 6 8 9        9 -- 5 6 8 10
 2 -- 0 1 3 4      6 -- 4 5 7 8 9 10    10 -- 6 7 9
 3 -- 0 2 4 5      7 -- 4 6 10
```

In [184]: `g_c0.vs["label"]`

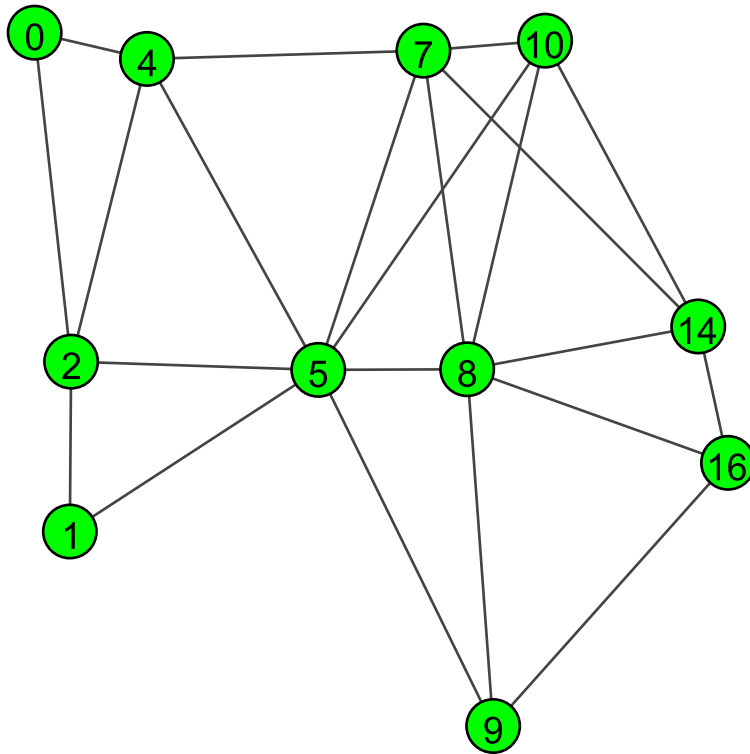
Out[184]: ['0', '1', '2', '4', '5', '7', '8', '9', '10', '14', '16']

In [182]: `g_c0.vs.attributes()`

Out[182]: ['x', 'y', 'label']

```
In [190]: 1 ig.plot(g_c0, **default_visual_style(g_c0))
```

Out[190]:



```
In [194]: 1 C0_sub=g_c0.community_infomap()
2
3 if len(C0_sub) > 1:
4     for n, g in enumerate(C0_sub):
5         print(f"n={n}, g={g}")
```

2.6 Big Data graph



Big Data ...

- we have data in CSV format, which is also known as *ncol* in the graph world

```
ABELARDO_COLLAZO_ARAUJO JUAN_MARTIN_LUNA    6
ABELARDO_COLLAZO        FERNANDO_HIERRO_CHOMON 7
ABEL_CABALLERO          ALFONSO_GUERRA    30
ABEL_CABALLERO          CARLOS_SOLCHAGA   14
ABEL_CABALLERO          ERNEST_LLUCH      8
ABEL_CABALLERO          FELIPE_GONZALEZ   33
```

- loading 0.42M vertices and 1.34M edges takes only 2 seconds in my notebook (intel i3, 4G RAM)

In []: ▶

1

In []: ▶

1