

Assignment 3A

In this assignment, you will implement and test Monte Carlo Tree Search.

TODO:

1. Enter your information below.
2. Rename `mcts_search_assigned.py` to `mcts_search.py`.
3. Complete the implementation of `mcts` in `mcts_search.py`.
4. Change the default A# from 'A12345678' to your own number.
5. Run all code.
6. Create a pdf version of the notebook.
7. Submit `mcts_search.py`, `assignment3a.pdf`, and `assignment3a.ipynb`. Do not zip them; attach and submit three separate files.

Enter your information below.

Name: ...

CWID: ...

```
In [1]: from game_boards import MNKNode, ConnectFour, DictGameNode
        from game_search import alpha_beta_search
        from game_play import maxplayer, randplayer, game_play
        from mcts_search import mcts
        from mcts_utils import ucb1, mcts_player, dot_graph, dot_graph_path

        from IPython.display import Image
```

```
In [2]: def create_empty_ttt():
        empty_board = []

        for _ in range(3):
            empty_board.append(['-', '-', '-'])

        return MNKNode(empty_board, k = 3)
```

```
In [3]: def create_empty_c4():
        empty_board = []

        for _ in range(6):
            empty_board.append(['-', '-', '-', '-', '-', '-', '-'])

        return ConnectFour(board=empty_board)
```

```
In [4]: moves = {'A': ['B', 'C', 'D'], 'B': ['E', 'F', 'G'], 'C': ['H', 'I'], 'D': ['J', 'K'],
               'E': ['L', 'M'], 'F': ['N', 'O'], 'G': ['P', 'Q'], 'H': ['R', 'S'], 'I': ['T', 'U'],
               'J': ['V', 'W'], 'K': ['X', 'Y'], 'L': ['Z'], 'M': ['A'], 'N': ['B'], 'O': ['C'],
               'P': ['D'], 'Q': ['E'], 'R': ['F'], 'S': ['G'], 'T': ['H'], 'U': ['I'], 'V': ['J'],
               'W': ['K'], 'X': ['L'], 'Y': ['M'], 'Z': ['N']}

terminal_nodes = {'E': 0.5, 'F': +1, 'G': 0.5, 'H': +1, 'I': 0, 'J': +1, 'L': +1, 'M': 0.5, 'N': 0.5,
                  'O': 0.5, 'P': 0.5, 'Q': 0.5, 'R': 0.5, 'S': 0.5, 'T': 0.5, 'U': 0.5, 'V': 0.5,
                  'W': 0.5, 'X': 0.5, 'Y': 0.5, 'Z': 0.5}

DictGameNode._moves = moves
DictGameNode.terminal_nodes = terminal_nodes
```

```
dg_initial_gn = DictGameNode(board = 'A', np = 'X')
```

```
In [5]: CWID='A12345678' # TODO Change to your own A#.

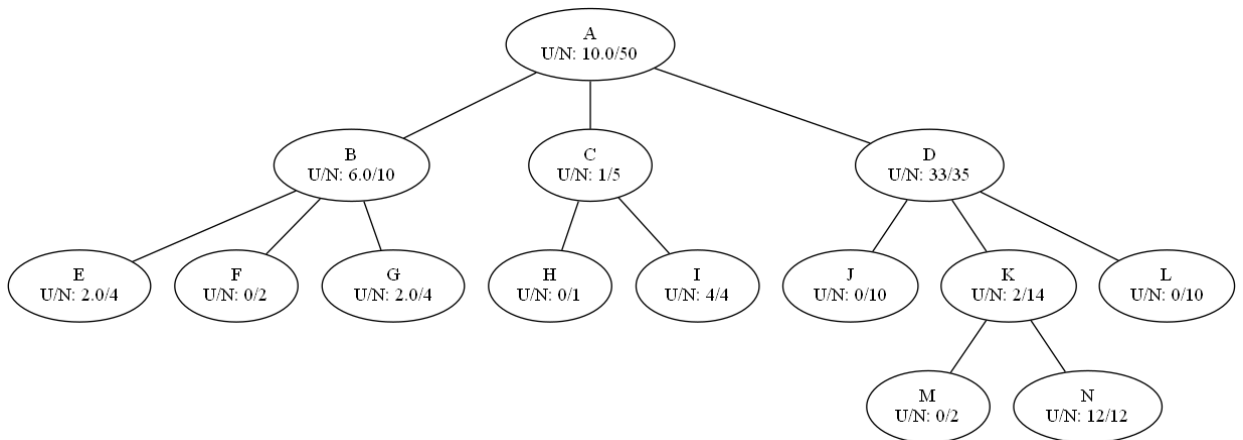
simul_seed = int(CWID[1:])
```

Testing out MCTS

Dictionary Game

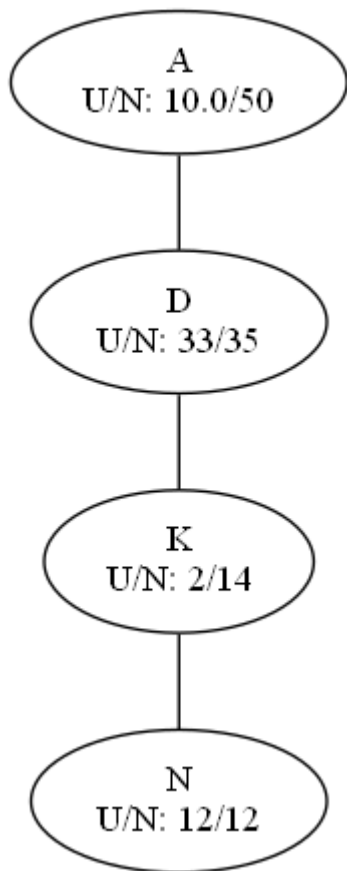
```
In [6]: dg_root_mcnode = mcts(dg_initial_gn, ucb1, seed=simul_seed, max_iter=50)
pydot_graph = dot_graph(dg_root_mcnode)
Image(pydot_graph.create_png())
```

Out[6]:



```
In [7]: pydot_graph = dot_graph_path(dg_root_mcnode)
Image(pydot_graph.create_png())
```

Out[7]:



Tic-Tac-Toe

```
In [8]: ttt_initial_gn = create_empty_ttt()
```

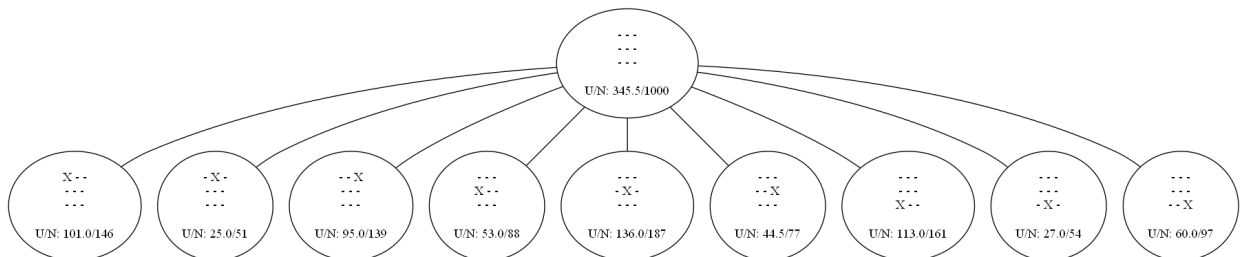
C=1.4

```
In [9]: util_f = lambda mcnode: ucb1(mcnode, C=1.4)
```

```
In [10]: ttt_root_mcnode = mcts(ttt_initial_gn, util_f, seed=simul_seed, max_iter=1000)
```

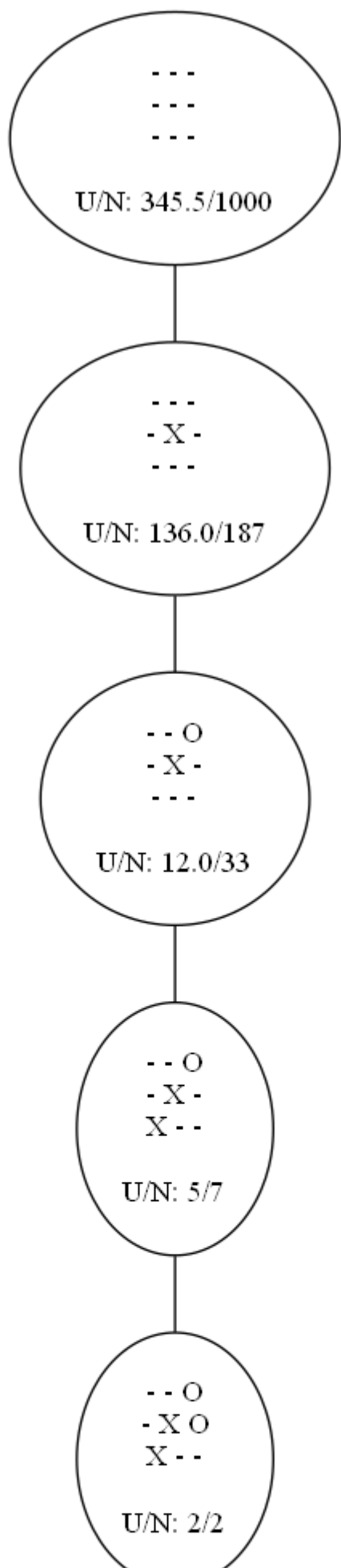
```
In [11]: pydot_graph = dot_graph(ttt_root_mcnode, max_nodes = 10)  
Image(pydot_graph.create_png())
```

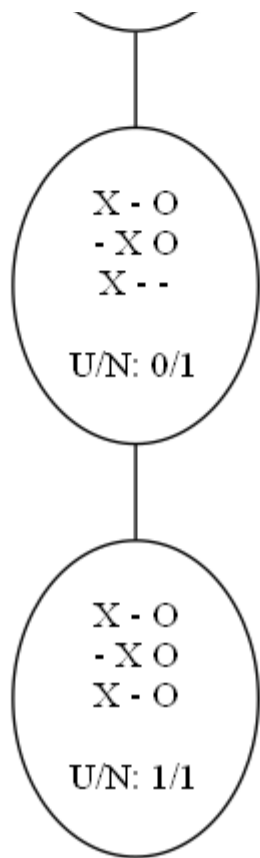
Out[11]:



```
In [12]: pydot_graph = dot_graph_path(ttt_root_mcnode)  
Image(pydot_graph.create_png())
```

Out[12]:





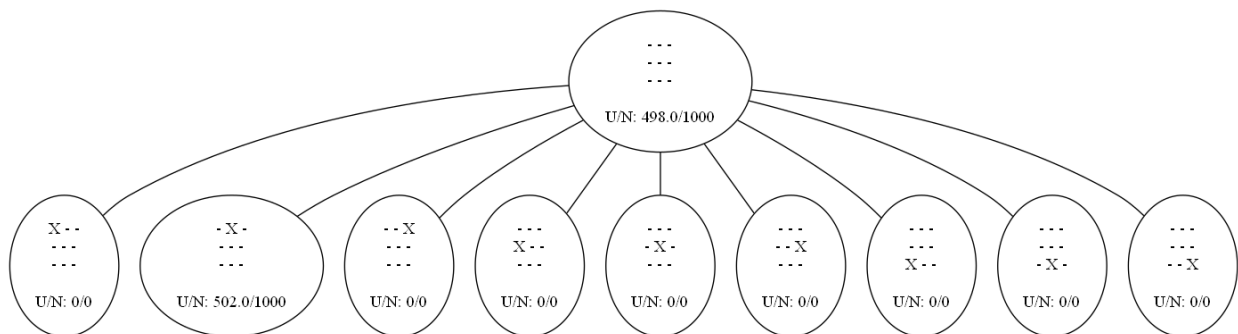
C=0

```
In [13]: util_f = lambda mcnode: ucb1(mcnode, C=0)
```

```
In [14]: ttt_root_mcnode = mcts(ttt_initial_gn, util_f, seed=simul_seed, max_iter=1000)
```

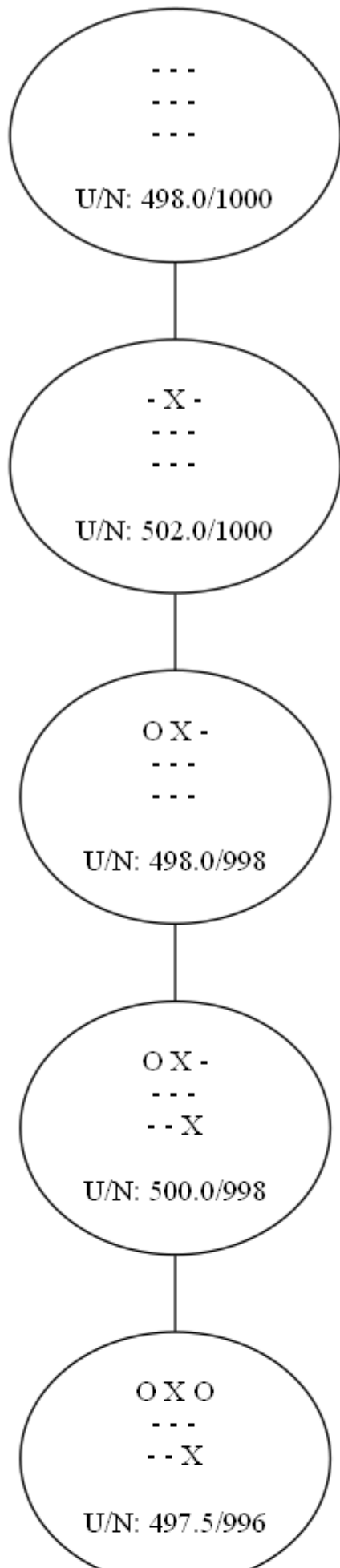
```
In [15]: pydot_graph = dot_graph(ttt_root_mcnode, max_nodes = 10)
          Image(pydot_graph.create_png())
```

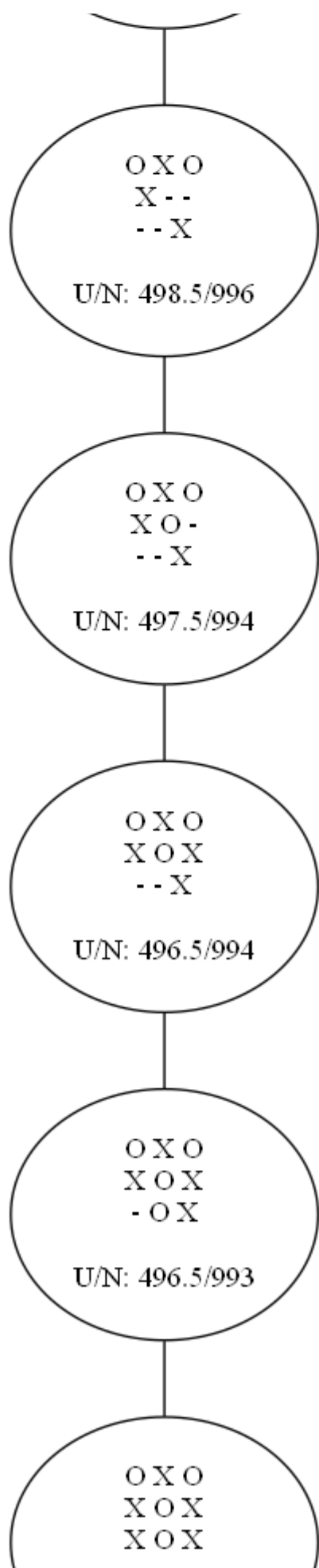
Out[15]:



```
In [16]: pydot_graph = dot_graph_path(ttt_root_mcnode)
          Image(pydot_graph.create_png())
```

Out[16]:





U/N: 496.0/992

Connect 4

```
In [17]: c4_initial_gn = create_empty_c4()
```

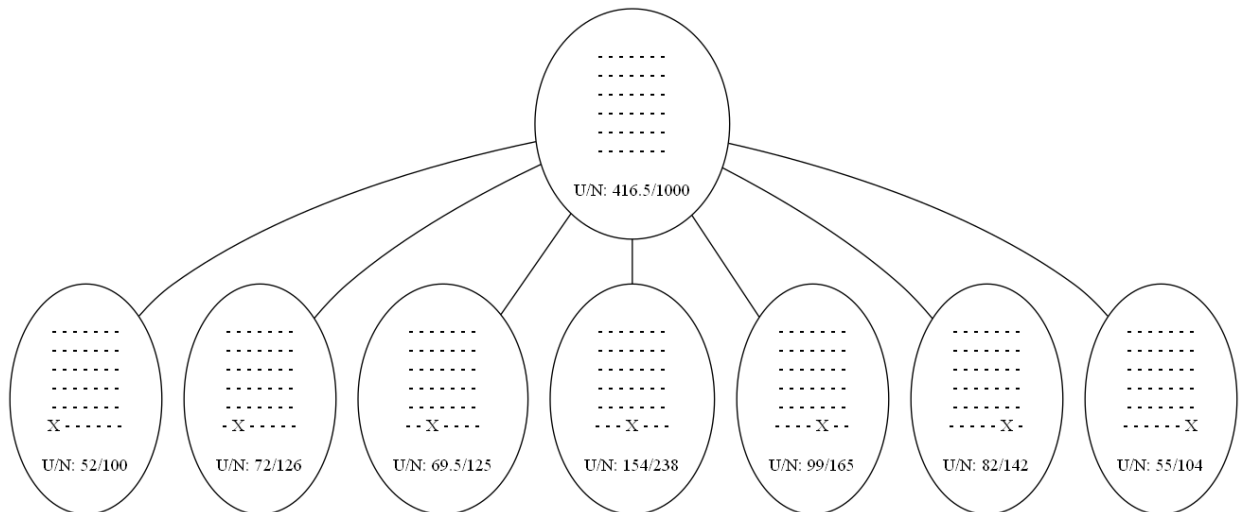
C=1.4

```
In [18]: util_f = lambda mcnode: ucb1(mcnode, C=1.4)
```

```
In [19]: c4_root_mcnode = mcts(c4_initial_gn, util_f, seed=simul_seed, max_iter=1000)
```

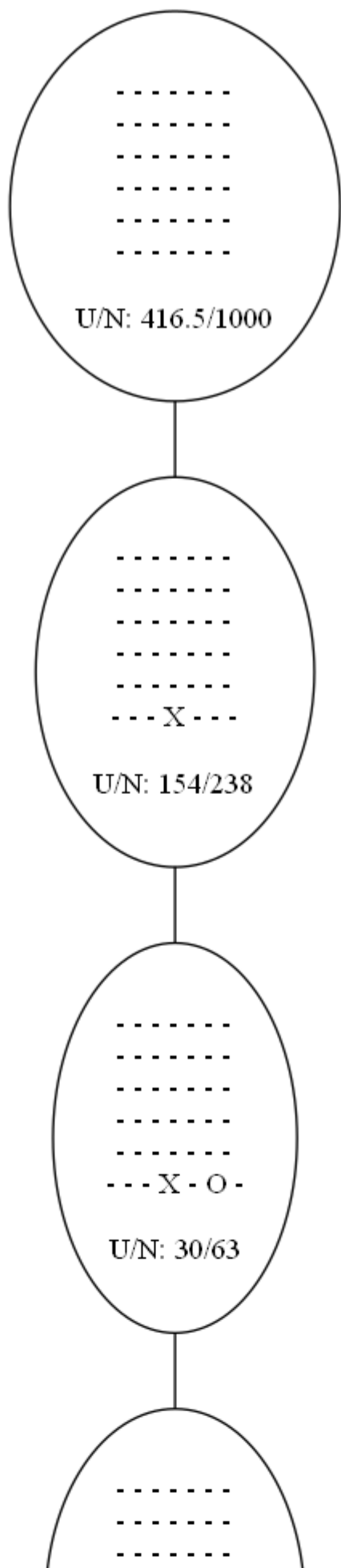
```
In [20]: pydot_graph = dot_graph(c4_root_mcnode, max_nodes = 8)  
Image(pydot_graph.create_png())
```

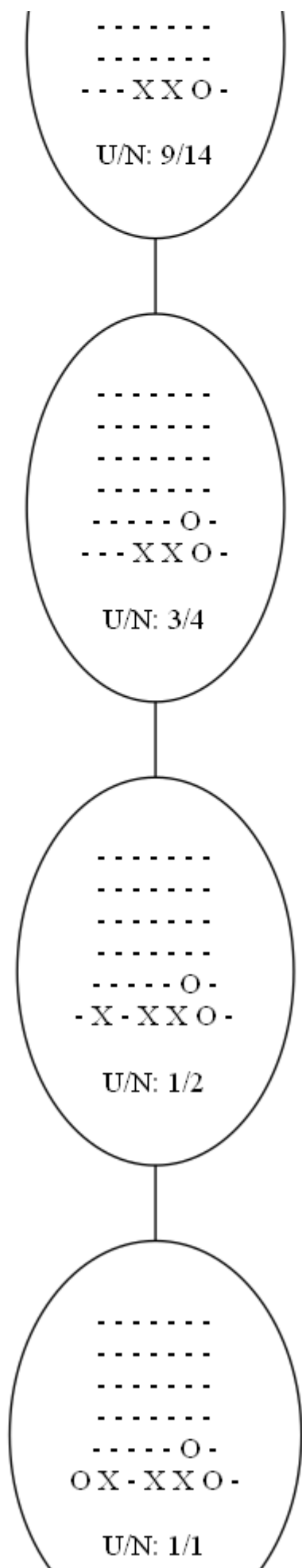
Out[20]:

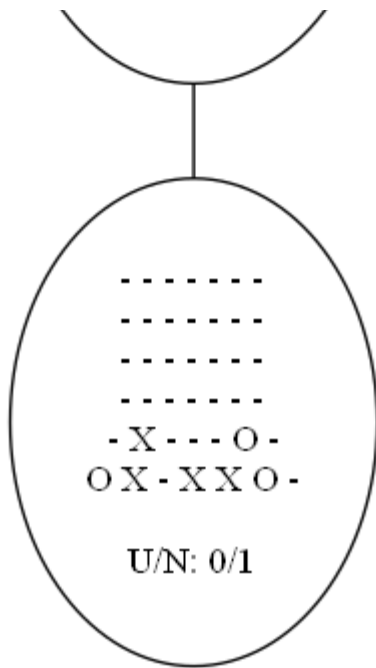


```
In [21]: pydot_graph = dot_graph_path(c4_root_mcnode)  
Image(pydot_graph.create_png())
```


Out[21]:







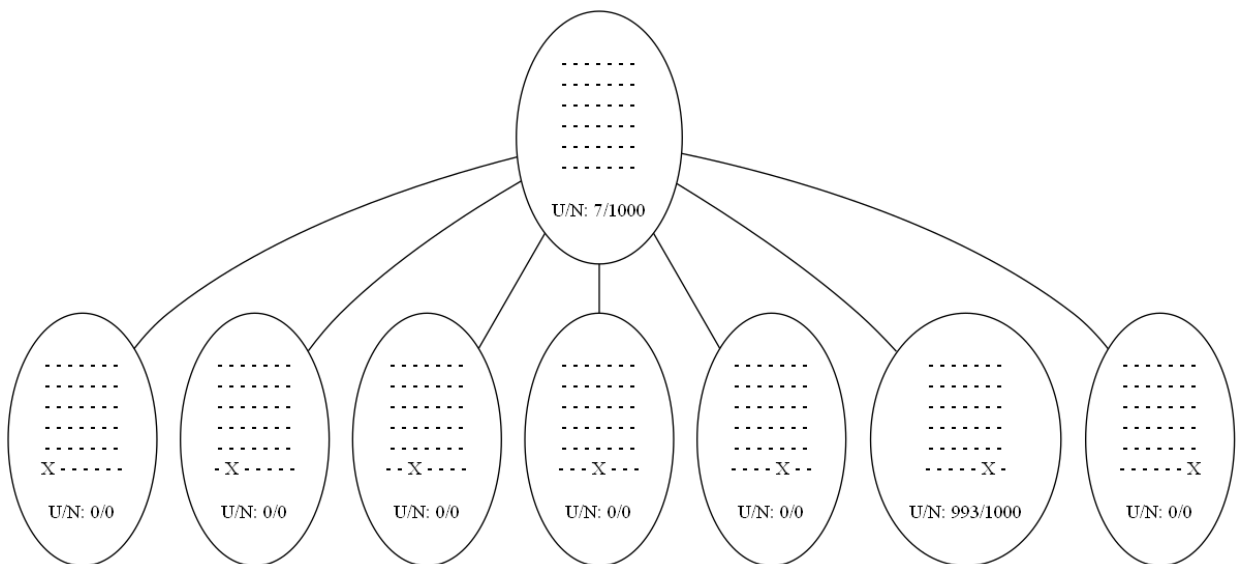
C = 0

```
In [22]: util_f = lambda mcnode: ucb1(mcnode, C=0)
```

```
In [23]: c4_root_mcnode = mcts(c4_initial_gn, util_f, seed=simul_seed, max_iter=1000)
```

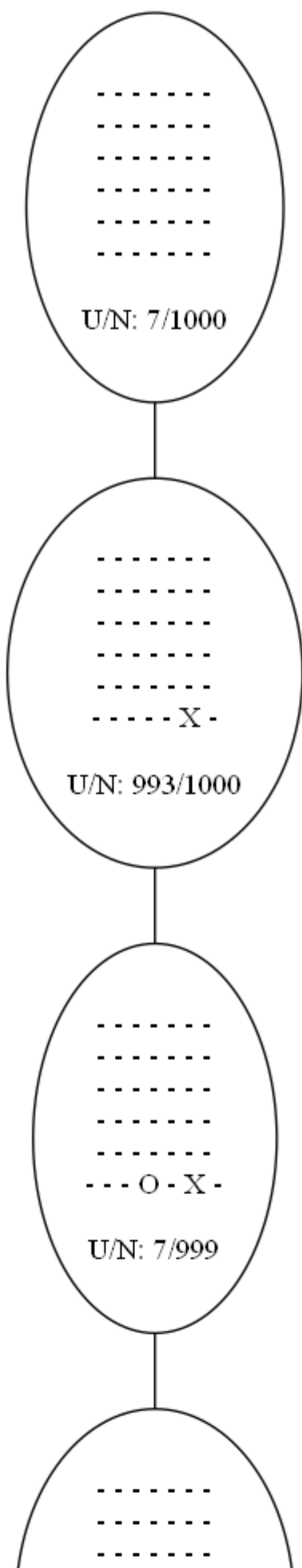
```
In [24]: pydot_graph = dot_graph(c4_root_mcnode, max_nodes = 8)
Image(pydot_graph.create_png())
```

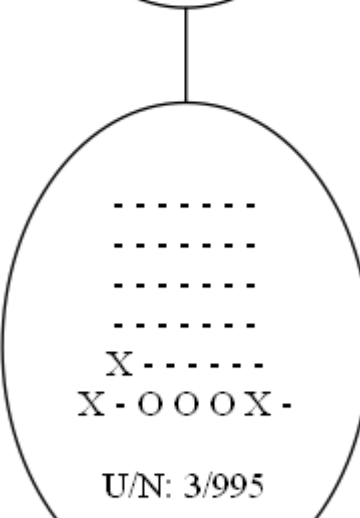
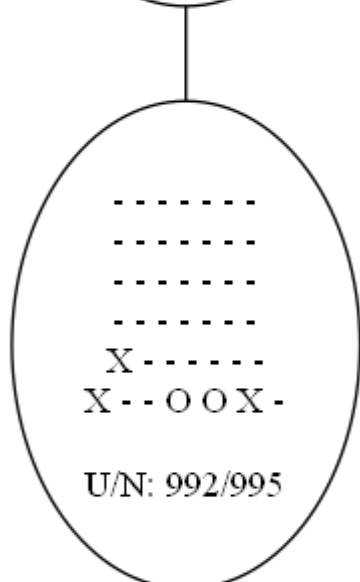
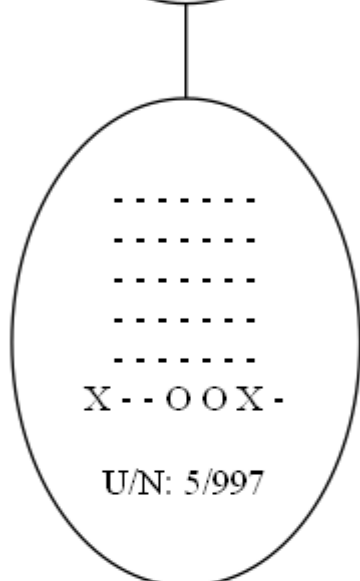
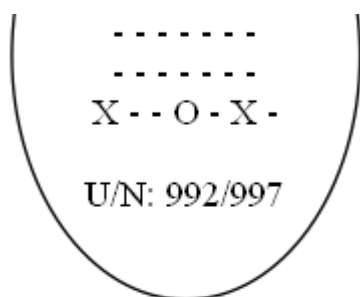
Out[24]:

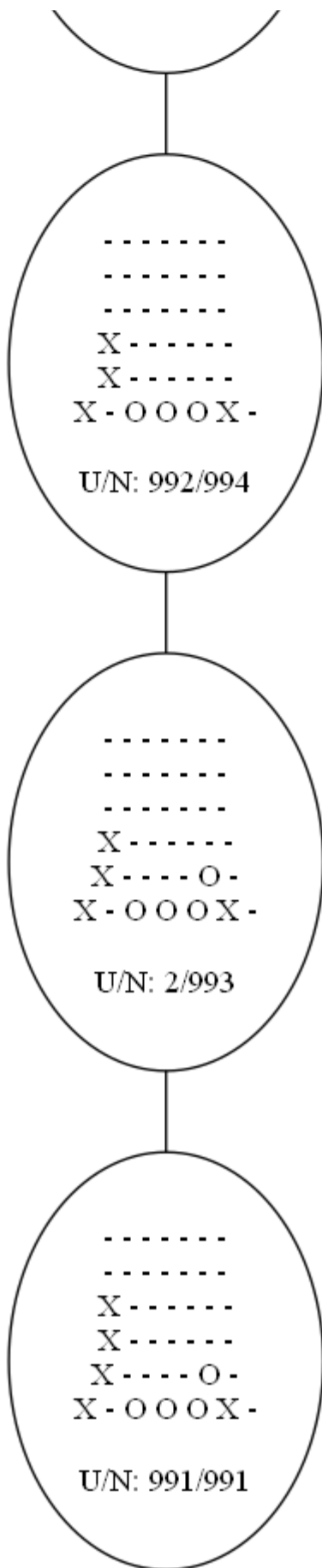


```
In [25]: pydot_graph = dot_graph_path(c4_root_mcnode)
Image(pydot_graph.create_png())
```

Out[25]:







MCTS vs Random Player

```
In [26]: util_f = lambda mcnode: ucb1(mcnode, C=1.4)

x_player = lambda b: mcts_player(b, util_f, seed = simul_seed, max_iter=1000)
o_player = lambda b: randplayer(b, seed=0)

game_play(ttt_initial_gn, x_player, o_player)

- - -
- - -
- - -

It's X's turn.
136.0/187 = 0.73
Chosen move (1, 1, 'X').

- - -
- X -
- - -

It's O's turn.
Chosen move (2, 1, 'O').

- - -
- X -
- O -

It's X's turn.
204.0/231 = 0.88
Chosen move (2, 0, 'X').

- - -
- X -
X O -

It's O's turn.
Chosen move (1, 0, 'O').

- - -
O X -
X O -

It's X's turn.
438/438 = 1.00
Chosen move (0, 2, 'X').

Game ended.
- - X
O X -
X O -

Winner is X.
```

```
In [27]: util_f = lambda mcnode: ucb1(mcnode, C=1.4)

x_player = lambda b: mcts_player(b, util_f, seed = simul_seed, max_iter=1000)
o_player = lambda b: randplayer(b, seed=0)

game_play(c4_initial_gn, x_player, o_player)
```



```

- - - - -
- - - - -
- - - - -
- - - - -
- - - - -
- - - - -

```

It's X's turn.
 $154/238 = 0.65$
 Chosen move (5, 3, 'X').

```

- - - - -
- - - - -
- - - - -
- - - - -
- - - - -
- - - X - - -

```

It's O's turn.
 Chosen move (5, 6, 'O').

```

- - - - -
- - - - -
- - - - -
- - - - -
- - - - -
- - - X - - 0

```

It's X's turn.
 $123/173 = 0.71$
 Chosen move (5, 1, 'X').

```

- - - - -
- - - - -
- - - - -
- - - - -
- - - - -
- X - X - - 0

```

It's O's turn.
 Chosen move (4, 6, 'O').

```

- - - - -
- - - - -
- - - - -
- - - - -
- - - - - 0
- X - X - - 0

```

It's X's turn.
 $355/410 = 0.87$
 Chosen move (5, 2, 'X').

```

- - - - -
- - - - -
- - - - -
- - - - -
- - - - - 0
- X X X - - 0

```

It's 0's turn.
Chosen move (3, 6, '0').

```
- - - - -  
- - - - -  
- - - - -  
- - - - - 0  
- - - - - 0  
- X X X - - 0
```

It's X's turn.
384/384 = 1.00
Chosen move (5, 0, 'X').

Game ended.

```
- - - - -  
- - - - -  
- - - - -  
- - - - - 0  
- - - - - 0  
X X X X - - 0
```

Winner is X.

MCTS vs Alpha-Beta

```
In [28]: util_f = lambda mcnode: ucb1(mcnode, C=1.4)  
  
x_player = lambda b: mcts_player(b, util_f, seed = simul_seed, max_iter=1000)  
o_player = lambda b: maxplayer(b, algo=alpha_beta_search)  
  
game_play(ttt_initial_gn, x_player, o_player)
```

- - -
- - -
- - -

It's X's turn.
 $136.0/187 = 0.73$
Chosen move (1, 1, 'X').

- - -
- X -
- - -

It's O's turn.
Chosen move (0, 0, 'O').

O - -
- X -
- - -

It's X's turn.
 $203.5/252 = 0.81$
Chosen move (0, 1, 'X').

O X -
- X -
- - -

It's O's turn.
Chosen move (2, 1, 'O').

O X -
- X -
- O -

It's X's turn.
 $223.5/337 = 0.66$
Chosen move (1, 0, 'X').

O X -
X X -
- O -

It's O's turn.
Chosen move (1, 2, 'O').

O X -
X X O
- O -

It's X's turn.
 $195.5/367 = 0.53$
Chosen move (0, 2, 'X').

O X X
X X O
- O -

It's O's turn.
Chosen move (2, 0, 'O').

```
O X X
X X O
O O -
```

It's X's turn.
 $500.0/1000 = 0.50$
Chosen move (2, 2, 'X').

Game ended.

```
O X X
X X O
O O X
```

Draw.

```
In [29]: util_f = lambda mcnode: ucb1(mcnode, C=1.4)

x_player = lambda b: maxplayer(b, algo=alpha_beta_search)
o_player = lambda b: mcts_player(b, util_f, seed = simul_seed, max_iter=1000)

game_play(ttt_initial_gn, x_player, o_player)
```

- - -
- - -
- - -

It's X's turn.
Chosen move (0, 0, 'X').

X - -
- - -
- - -

It's O's turn.
 $114.0/260 = 0.44$
Chosen move (1, 1, 'O').

X - -
- O -
- - -

It's X's turn.
Chosen move (0, 1, 'X').

X X -
- O -
- - -

It's O's turn.
 $420.5/730 = 0.58$
Chosen move (0, 2, 'O').

X X O
- O -
- - -

It's X's turn.
Chosen move (2, 0, 'X').

X X O
- O -
X - -

It's O's turn.
 $465.5/858 = 0.54$
Chosen move (1, 0, 'O').

X X O
O O -
X - -

It's X's turn.
Chosen move (1, 2, 'X').

X X O
O O X
X - -

It's O's turn.
 $250.0/500 = 0.50$
Chosen move (2, 1, 'O').

```
X X O
O O X
X O -
```

It's X's turn.
Chosen move (2, 2, 'X').

```
Game ended.
X X O
O O X
X O X
```

Draw.

In []: