

# Nondeterministic Bigraphs and Their Use in Modelling Movement

Paulius Dilkas

Formal Analysis, Theory and Algorithms

16th October 2018

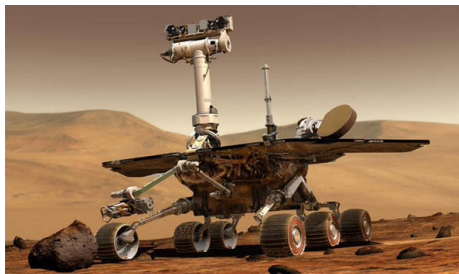
# Motivation



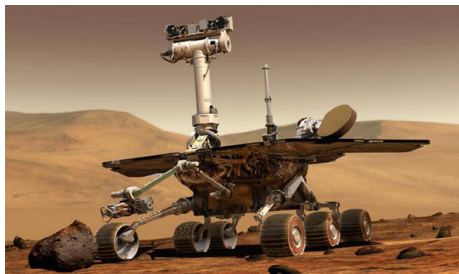
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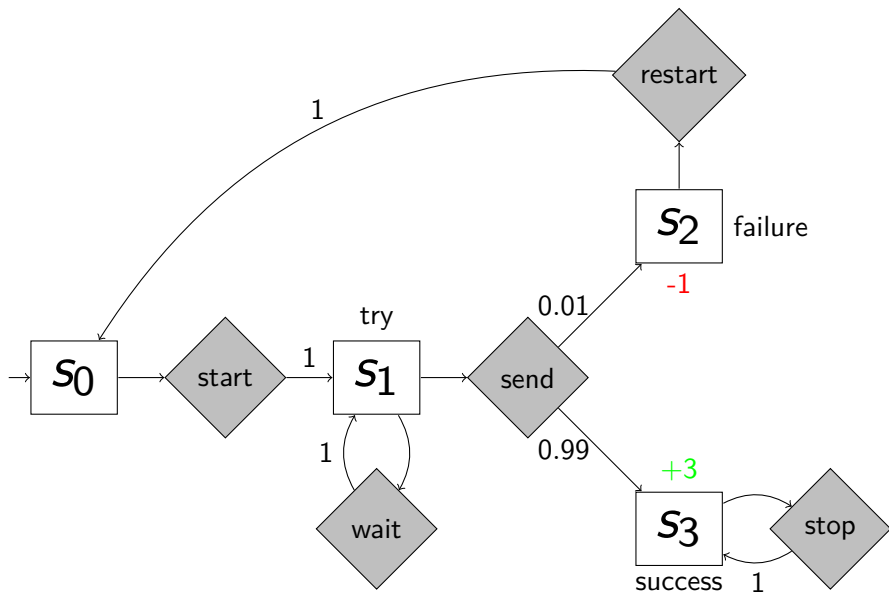
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# Markov Decision Process



# Collecting Objects in a Grid

- Each cell is either visited or unvisited.

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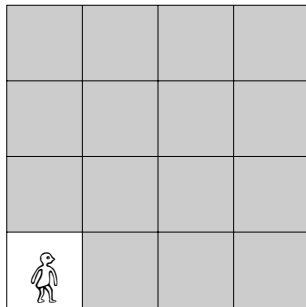
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- When entering an unvisited cell, with probability  $p$  the agent receives an object.



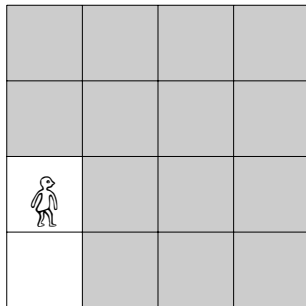
# Collecting Objects in a Grid

- Each cell is either visited or unvisited.
- When entering an unvisited cell, with probability  $p$  the agent receives an object.
- Once a set number of objects is collected, the agent heads home.

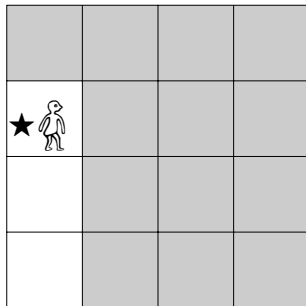
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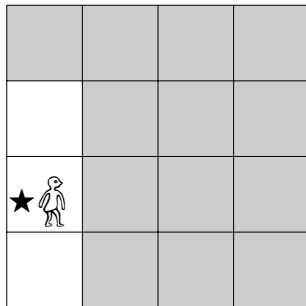
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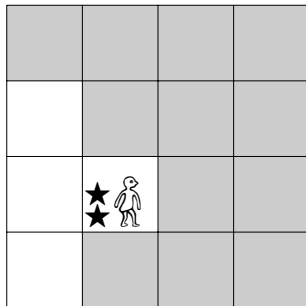
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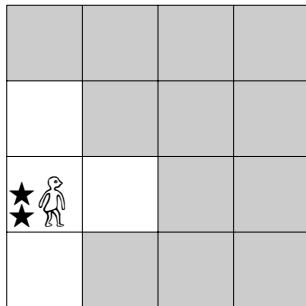
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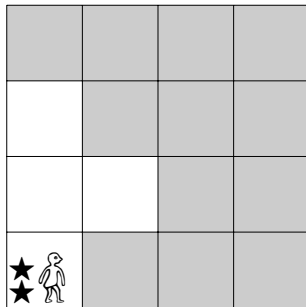
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- Controls (types of nodes)

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  - ▶ Agent, Cell, Directions, Object

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  - ▶ home: is in the southwest corner of the grid

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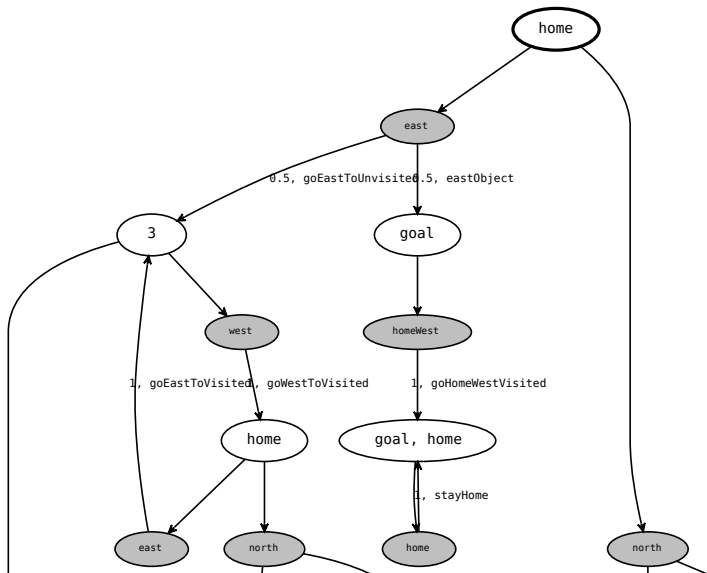
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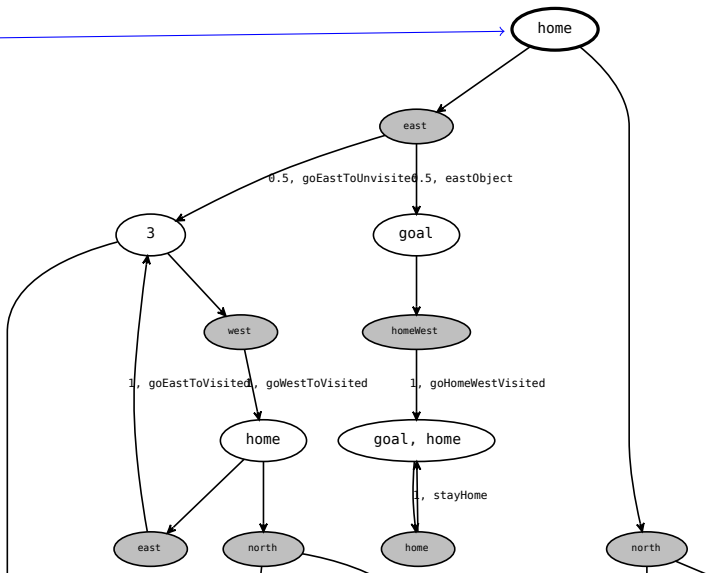
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  - ▶ Priority 1: going/staying home (5 rules)
  - ▶ Priority 2: 3 rules for each direction
    - ★ visited
    - ★ unvisited
    - ★ unvisited + object

# Transition System



# Transition System

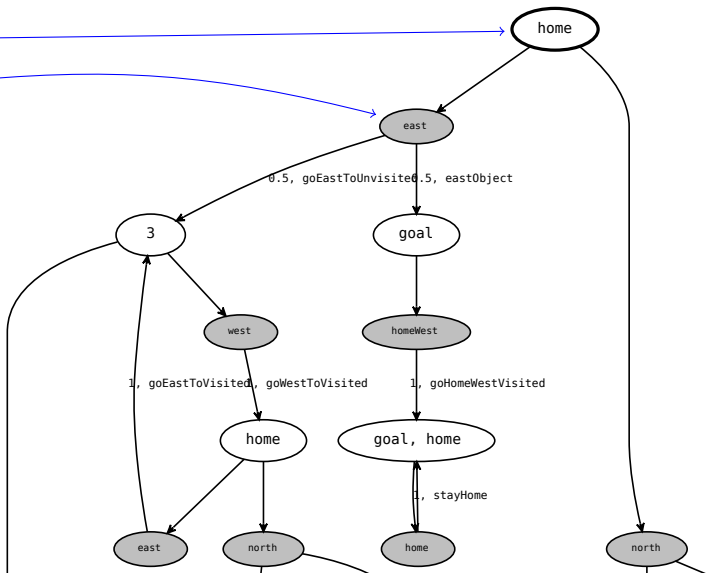
- States



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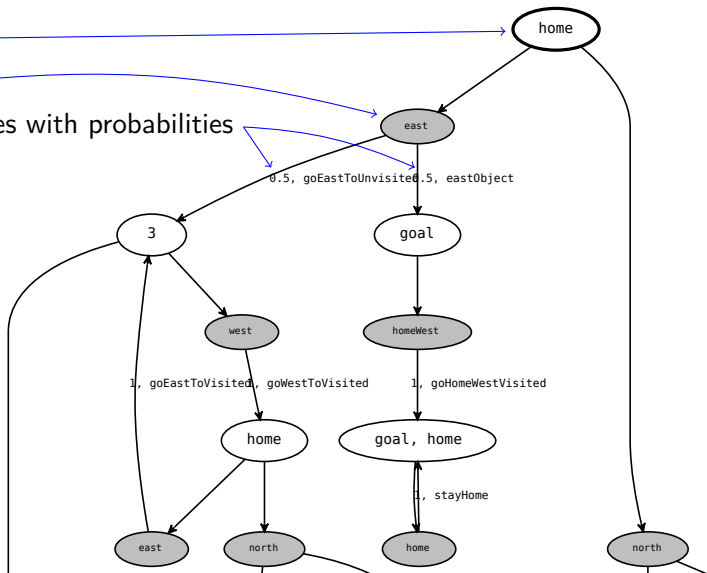
- States

- Actions



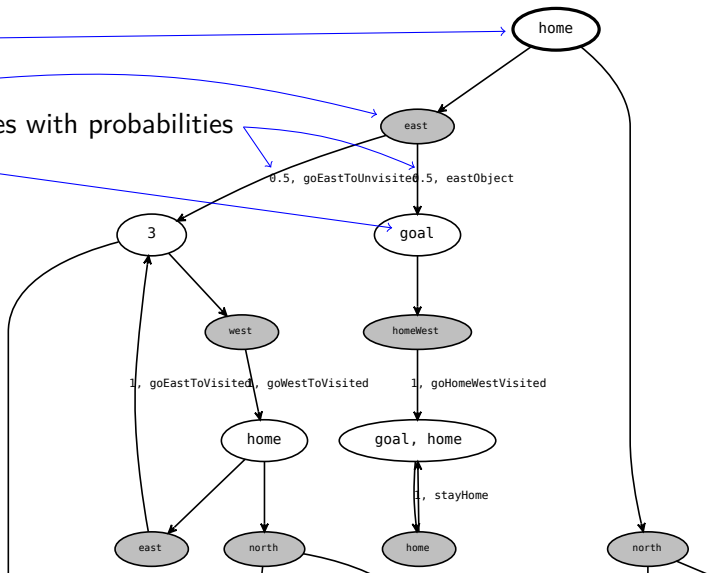
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- States
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- Reaction rules with probabilities



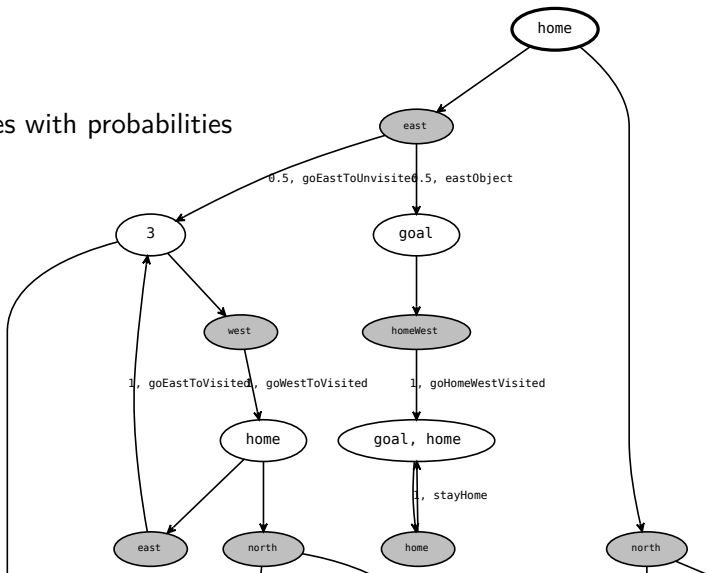
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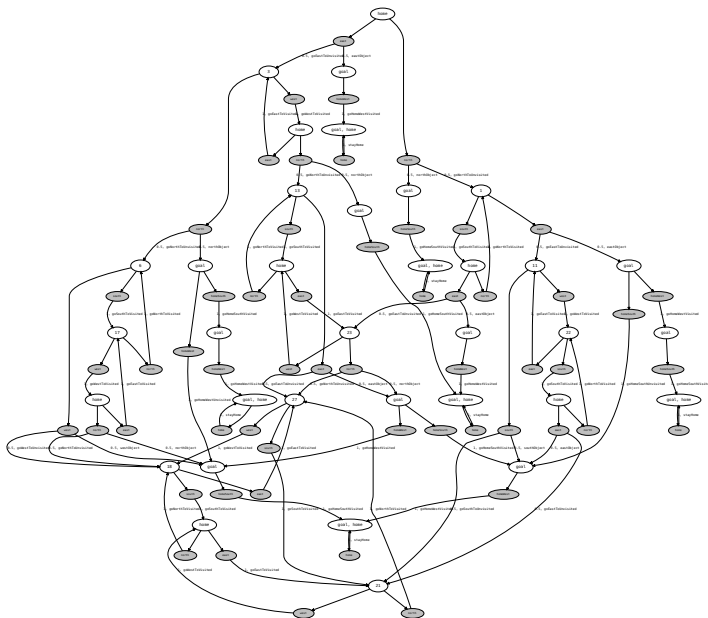


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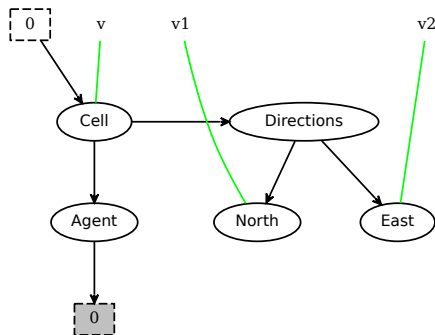
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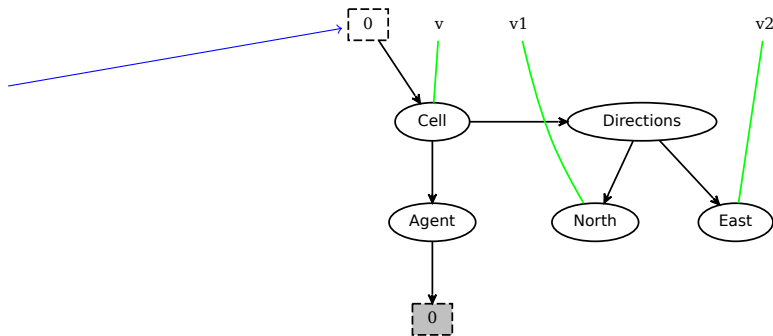
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  - ▶ Priorities and actions are orthogonal concepts
- Normalise probabilities per action
  - ▶ Caveat: one rule can sometimes be applied in multiple ways
  - ▶ In that case, each outcome is equally likely
- Either:
  - ▶ Breadth first search to generate the full transition system
  - ▶ Or select the next state randomly for a simulation

# Bigraphs

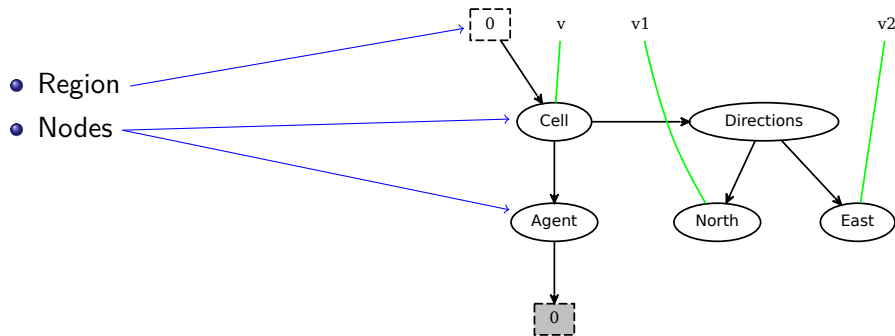


# Bigraphs

- Region

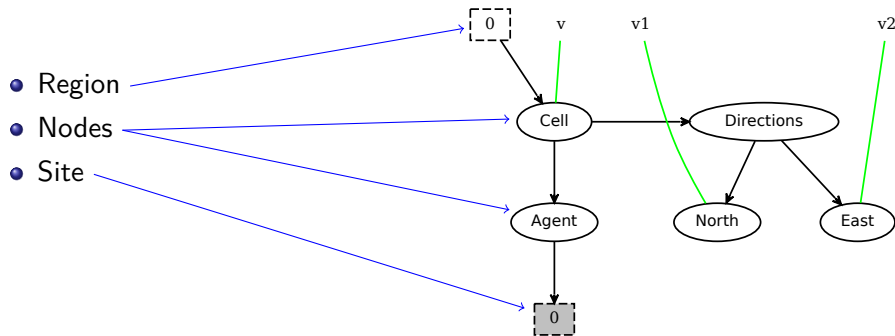


# Bigraphs



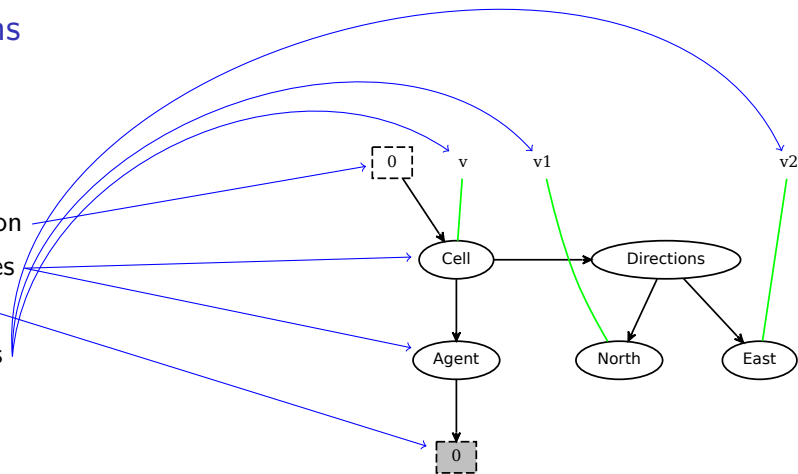


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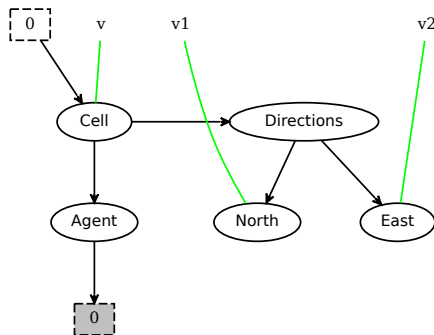


# Bigraphs

- Region
- Nodes
- Site
- Links



# Bigraphs

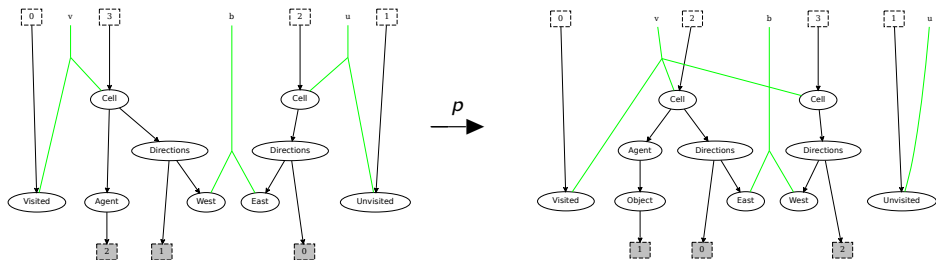


```
big home = Cell{v}.(Directions.(North{v1}
                                | East{v2})
                    | Agent);
```

# Initial State

```
big initial = Visited{v}
              || Unvisited{u}
              # bottom left
              || Cell{v}.(Directions.(North{a}
                                      | East{b}))
                                      | Agent.1)
              # top left
              || Cell{u}.Directions.(East{c}
                                      | South{a})
              # bottom right
              || Cell{u}.Directions.(North{d}
                                      | West{b})
              # top right
              || Cell{u}.Directions.(West{c}
                                      | South{d});
```

# Reaction Rule: Go West and Collect an Object



# A Tale of Schrödinger's Wall...



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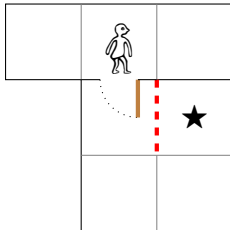


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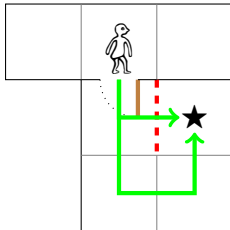




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  - ▶ Agent, Cell, Directions, Goal, Node
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  - ▶ no Object, no Visited/Unvisited
- Reaction rules
  - ▶ Priority 1: generating the room (2 rules in 1 action)

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- ▶ Priority 1: generating the room (2 rules in 1 action)
- ▶ Priority 2: movement in 6 directions (including going in/out)
  - ★ each rule in a separate action

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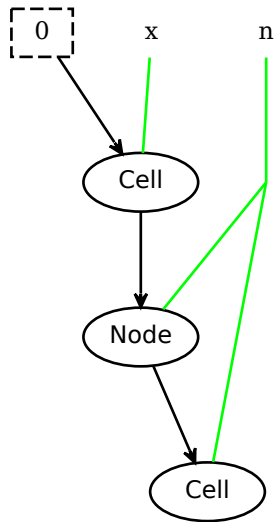
- Reaction rules

- ▶ Priority 1: generating the room (2 rules in 1 action)
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  - ★ each rule in a separate action

- Predicate

- ▶ is Agent and Goal in the same cell?

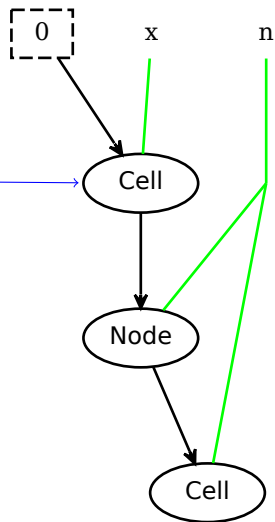
# The Main Idea





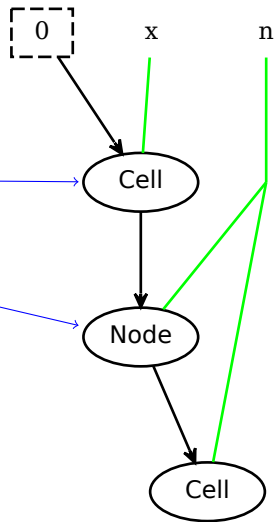
# The Main Idea

- Outside the door



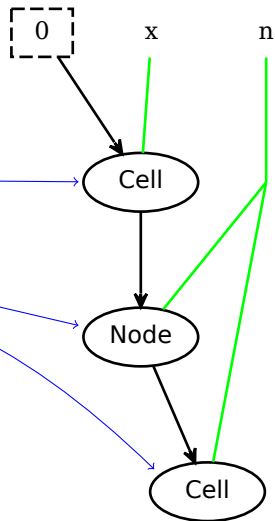
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- Outside the door
- The room



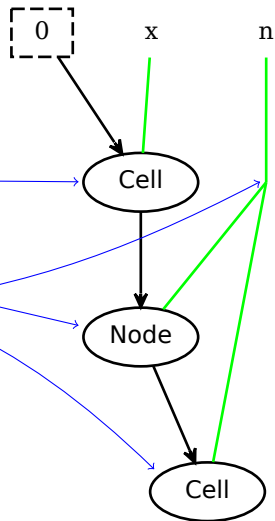
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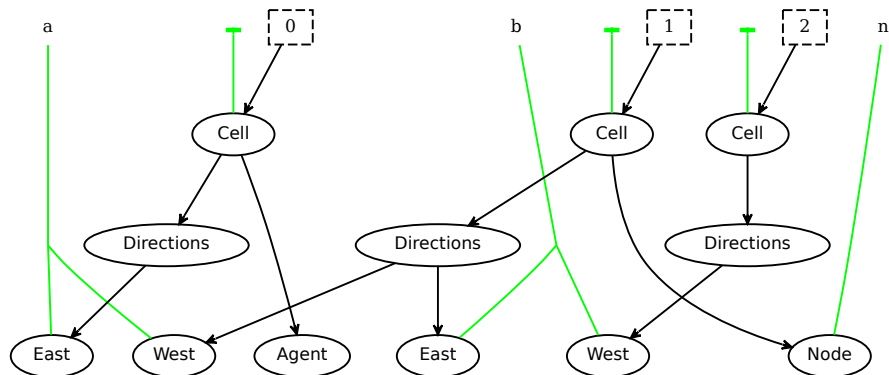


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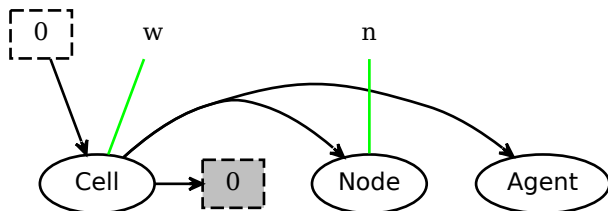
- Outside the door
- The room
- Inside the door
- Which cell is closest to the door?



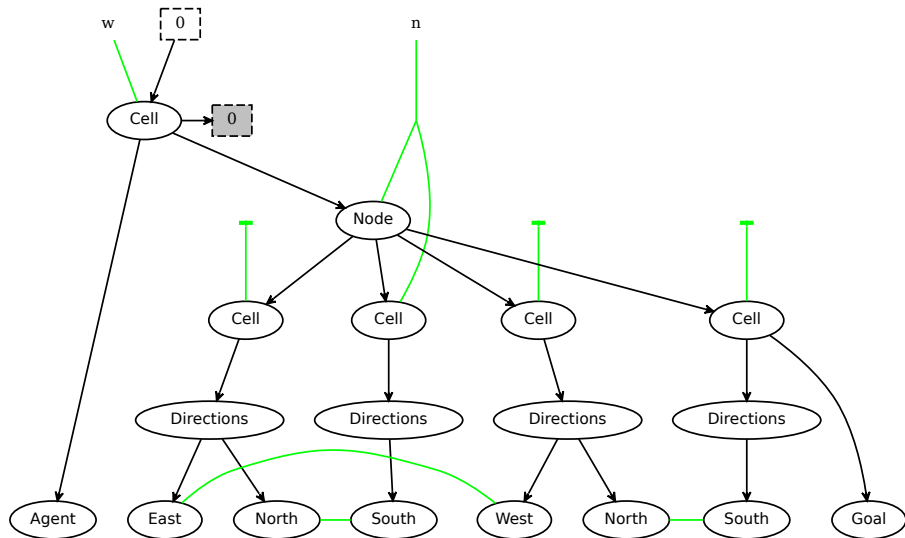
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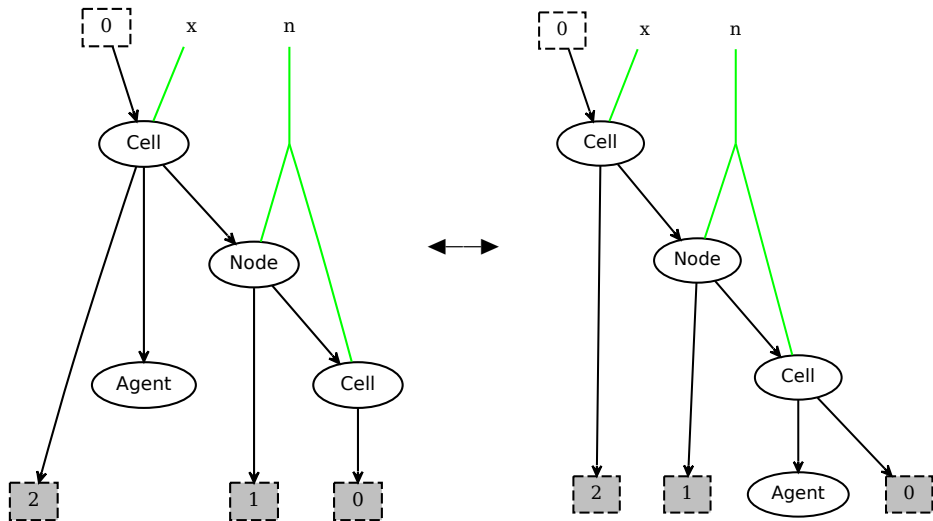
# Opening the Door



# Opening the Door



# Entering/Leaving a Room






# Entering/Leaving a Room

```
action goIn
  react goIn = Cell{x}.(Agent | Node{n}.(Cell{n}
                                     | id)
                               | id)
    - [1.0] ->
    Cell{x}.(Node{n}.(Cell{n}.(Agent
                               | id)
                             | id)
              | id);
end
```

# Entering/Leaving a Room

Action rewards



```
action goIn[1]
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# Tracking Time with State Rewards

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big agent = Agent;  
  
begin nbrs  
  init initialState;  
  rules = [ {...}, {...} ];  
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end
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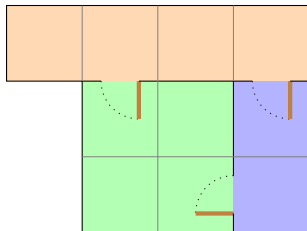
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- List of predicates
- Predicate rewards (optional)

# Extensions

- Multiple rooms (make each Node uniquely identifiable)

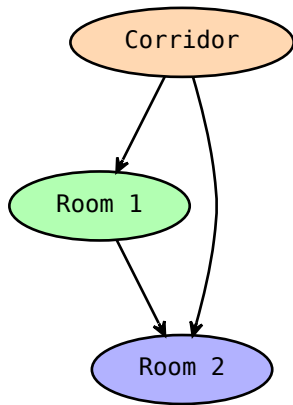
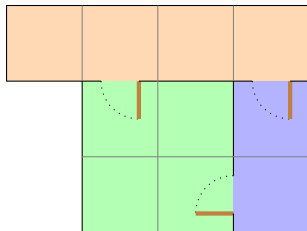
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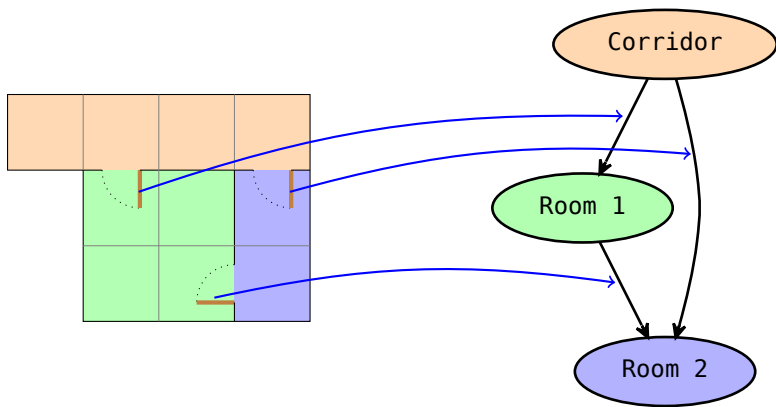
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- Two ideas in one: discovering space & entering an inner space



# A New Interface

Jupyter Example Last Checkpoint: a minute ago (autosaved)

Logout

File Edit View Insert Cell Kernel Widgets Help

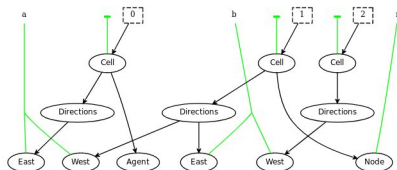
Trusted

BigraphER 1.7.0 (OCaml 4.06.0)

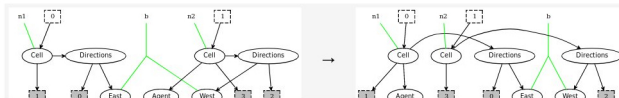
Code

```
In [1]: 1 ctrl Cell = 1;
2 ctrl Directions = 0;
3 ctrl Node = 1;
4 atomic ctrl Agent = 0;
5 atomic ctrl East = 1;
6 atomic ctrl West = 1;
7 big initial = /x /y /z {
8   Cell{x}.(Directions.East{a} | Agent)
9   || Cell{y}.(Directions.{East{b} | West{a}}
10    | Node{n}.1)
11   || Cell{z}.Directions.West{b});
12 react goWest = Cell{n1}.Directions.{East{b} | id} | id
13   || Cell{n2}.Directions.{West{b} | id} | Agent | id
14   -[1.0]->
15   Cell{n1}.Directions.{East{b} | id} | Agent | id
16   || Cell{n2}.Directions.{West{b} | id} | id;
```

Out[1]: initial



Out[1]: goWest



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  - ▶ with state bigraph preview on mouseover

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- Backwards compatible to run OCaml code

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  - ▶ adding/subtracting integers

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- + A direct visual representation of the modelled situation
- + Succinct and easy to modify
- + Can generate any MDP
- + Transition system can be exported to PRISM
  - with some limitations (e.g., no transition rewards)
- Probabilities are constant and cannot easily depend on state
- Some simple ideas are impossible or hard to implement
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*Thank You!*