

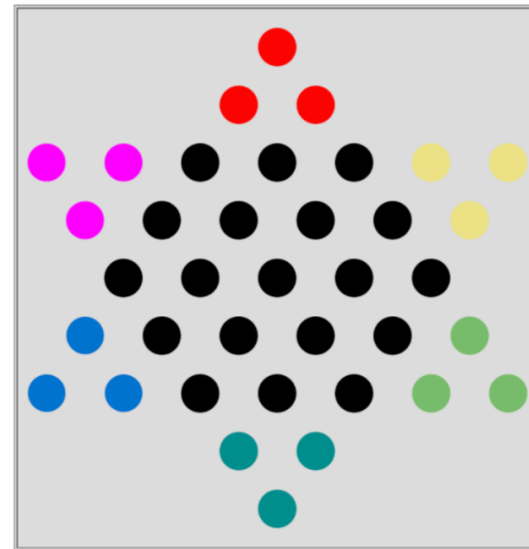
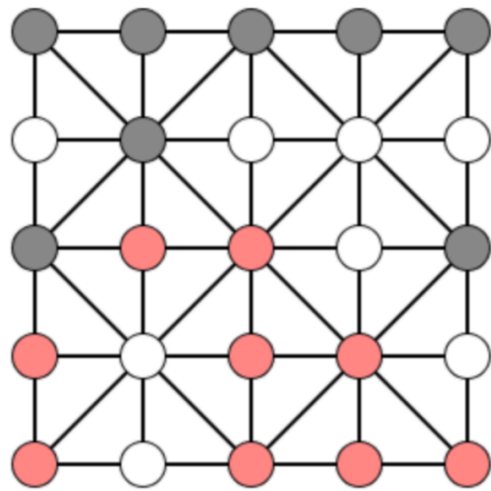
# Inductive general game playing

Andrew Cropper, Richard Evans, and Mark Law

# Inductive general game ~~playing~~

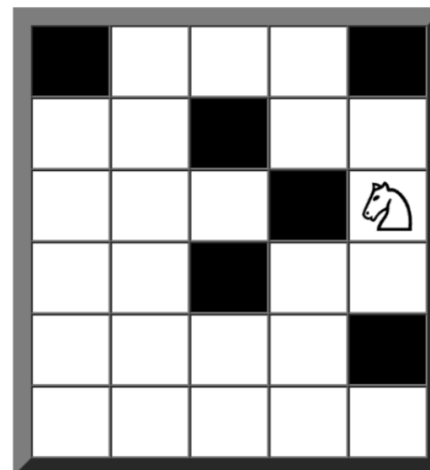
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# General game playing competition



|   |   |   |
|---|---|---|
| 8 |   | 6 |
| 4 | 7 | 3 |
| 5 | 2 | 1 |

|   |   |   |
|---|---|---|
| o |   | x |
| o | o | x |
| x |   |   |



|   |   |   |   |
|---|---|---|---|
|   | o | o |   |
| o | o | o |   |
|   | o | o | o |
|   |   |   |   |

Springtime

# Game description language

- initial game state
- legal moves
- how moves update the game state
- how the game terminates

# Game description language

```
(succ 0 1)
(succ 1 2)
(succ 2 3)
(beats scissors paper)
(beats paper stone)
(beats stone scissors)
(<= (next (step ?n)) (true (step ?m)) (succ ?m ?n))
(<= (next (score ?p ?n)) (true (score ?p ?n)) (draws ?p))
(<= (next (score ?p ?n)) (true (score ?p ?n)) (loses ?p))
(<= (next (score ?p ?n)) (true (score ?p ?n2)) (succ ?n2 ?n) (wins ?p))
(<= (draws ?p) (does ?p ?a) (does ?q ?a) (distinct ?p ?q))
(<= (wins ?p) (does ?p ?a1) (does ?q ?a2) (distinct ?p ?q) (beats ?a1 ?a2))
(<= (loses ?p) (does ?p ?a1) (does ?q ?a2) (distinct ?p ?q) (beats ?a2 ?a1))
```

# Our problem

Learn rules from observations

- goal
- legal
- next
- terminal

# Why?

- Diverse games
- New problems each year
- Independent language
- *Hard problems?*

# Capablanca





# Rock, paper, scissors

% BK

```
beats(paper, stone).
beats(scissors, paper).
beats(stone, scissors).
player(p1).
player(p2).
succ(0, 1).
succ(1, 2).
succ(2, 3).
does(p1, stone).
does(p2, paper).
true_score(p1, 0).
true_score(p2, 0).
true_step(0).
```

% E+

```
next_score(p1, 0).
next_score(p2, 1).
next_step(1).
```

% E-

```
next_score(p2, 0).
next_score(p1, 1).
next_score(p1, 2).
next_score(p2, 2).
next_score(p1, 3).
next_score(p2, 3).
next_step(0).
next_step(2).
next_step(3).
```

# Rock, paper, scissors

```
next_step(N):-  
    true_step(M),  
    succ(M,N).  
next_score(P,N):-  
    true_score(P,N),  
    draws(P).  
next_score(P,N):-  
    true_score(P,N),  
    loses(P).  
next_score(P,N2):-  
    true_score(P,N1),  
    succ(N2,N1),  
    wins(P).
```

```
draws(P):-  
    does(P,A),  
    does(Q,A),  
    distinct(P,Q).  
loses(P):-  
    does(P,A1),  
    does(Q,A2),  
    distinct(P,Q),  
    beats(A2,A1).  
wins(P):-  
    does(P,A1),  
    does(Q,A2),  
    distinct(P,Q),  
    beats(A1,A2).
```

| Game                  | R  | L  | D | P |
|-----------------------|----|----|---|---|
| Minimal Decay         | 2  | 6  | 0 | 1 |
| Minimal Even          | 8  | 19 | 0 | 1 |
| Rainbow               | 10 | 48 | 0 | 1 |
| Rock Paper Scissors   | 12 | 36 | 0 | 1 |
| GT Chicken            | 16 | 78 | 0 | 2 |
| GT Attrition          | 16 | 60 | 0 | 2 |
| Coins                 | 16 | 45 | 0 | 1 |
| Buttons and Lights    | 16 | 44 | 1 | 1 |
| Leafy                 | 17 | 80 | 2 | 2 |
| GT Prisoner           | 17 | 75 | 0 | 2 |
| Eight Puzzle          | 17 | 60 | 2 | 1 |
| Lightboard            | 18 | 69 | 2 | 2 |
| Knights Tour          | 18 | 46 | 2 | 1 |
| Sukoshi               | 19 | 49 | 1 | 2 |
| Walkabout             | 22 | 66 | 2 | 2 |
| Horseshoe             | 22 | 59 | 2 | 2 |
| GT Ultimatum          | 22 | 67 | 0 | 2 |
| Tron                  | 23 | 76 | 2 | 2 |
| 9x Buttons and Lights | 24 | 77 | 2 | 1 |
| Hunter                | 24 | 69 | 2 | 1 |
| GT Centipede          | 24 | 69 | 0 | 2 |
| Fizz Buzz             | 25 | 74 | 0 | 1 |
| Untwisty Corridor     | 27 | 68 | 0 | 1 |
| Don't Touch           | 29 | 84 | 2 | 2 |
| Tiger vs Dogs         | 30 | 88 | 2 | 2 |

| Game              | R   | L   | D | P |
|-------------------|-----|-----|---|---|
| Sheep and Wolf    | 30  | 89  | 2 | 2 |
| Duikoshi          | 31  | 76  | 2 | 2 |
| TicTacToe         | 32  | 92  | 2 | 2 |
| HexForThree       | 35  | 130 | 2 | 3 |
| Connect 4         | 36  | 124 | 2 | 4 |
| Breakthrough      | 36  | 126 | 2 | 2 |
| Centipede         | 37  | 134 | 2 | 1 |
| Forager           | 40  | 106 | 2 | 1 |
| Sudoku            | 41  | 101 | 2 | 1 |
| Sokoban           | 41  | 172 | 2 | 1 |
| 9x TicTacToe      | 42  | 149 | 2 | 2 |
| Switches          | 44  | 183 | 2 | 1 |
| Battle of Numbers | 44  | 134 | 2 | 2 |
| Free For All      | 46  | 130 | 2 | 2 |
| Alquerque         | 49  | 134 | 2 | 2 |
| Kono              | 50  | 134 | 2 | 2 |
| Checkers          | 52  | 167 | 2 | 2 |
| Pentago           | 53  | 188 | 2 | 2 |
| Platform Jumpers  | 62  | 168 | 2 | 2 |
| Pilgrimage        | 80  | 240 | 2 | 2 |
| Firesheep         | 85  | 290 | 2 | 2 |
| Farming Quandries | 88  | 451 | 2 | 2 |
| TTCC4             | 94  | 301 | 2 | 2 |
| Frogs and Toads   | 97  | 431 | 2 | 2 |
| Asylum            | 101 | 273 | 2 | 2 |

# Fizzbuzz BK

```
divisible(12,1).
divisible(12,2).
...
divisible(12,12).
input_say(player,1).
input_say(player,2).
...
input_say(player,30).
input_say(player,fizz).
input_say(player,buzz).
input_say(player,fizzbuzz).
role(player).
int(0).
int(1).
...
int(31).
```

```
less_than(0,1).
less_than(0,2).
...
less_than(30, 31).
minus(1,1,0).
minus(2,1,1).
...
minus(31,31,0).
positive_int(1).
positive_int(2).
...
positive_int(31).
succ(0,1).
succ(0,2).
...
succ(30,31).
```

# Fizzbuzz legal

% BK

```
true_count(9).  
true_success(6).
```

% E+

```
legal_say(player, 9)  
legal_say(player, buzz)  
legal_say(player, fizz)  
legal_say(player, fizzbuzz)
```

% E-

```
legal_say(player, 0).  
legal_say(player, 1).  
...  
legal_say(player, 8).  
legal_say(player, 10).  
...  
legal_say(player, 31).
```

# Fizzbuzz legal

% BK

```
true_count(9).  
true_success(6).
```

% E+

```
legal_say(player,9)  
legal_say(player,buzz)  
legal_say(player,fizz)  
legal_say(player,fizzbuzz)
```

% E-

```
legal_say(player,0).  
legal_say(player,1).  
...  
legal_say(player,8).  
legal_say(player,10).  
...  
legal_say(player,31).
```

% Hypothesis

```
legal_say(player,N):-  
    true_count(N).  
legal_say(player,fizz).  
legal_say(player,buzz).  
legal_say(player,fizzbuzz).
```

# Fizzbuzz next count

% BK

```
does_say(player,buzz).  
true_count(12).
```

% E+

```
next_count(13).
```

% E-

```
next_count(0).  
next_count(1).
```

...

```
next_count(12).  
next_count(14).
```

...

```
next_count(31).
```

# Fizzbuzz next count

```
% BK  
does_say(player,buzz).  
true_count(12).
```

```
% E+  
next_count(13).
```

```
% E-  
next_count(0).  
next_count(1).  
...  
next_count(12).  
next_count(14).  
...  
next_count(31).
```

```
% hypothesis  
next_count(After):-  
    true_count(Before),  
    succ(Before,after).
```



# Fizzbuzz next success

% BK

```
does_say(player,buzz).  
true_success(3).
```

% E+

```
next_success(3).
```

% E-

```
next_success(0).
```

```
next_success(1).
```

```
next_success(2).
```

```
next_success(4).
```

...

```
next_success(31).
```

# Fizzbuzz next success

```
next_success(After):-  
    correct,  
    true_success(Before),  
    succ(Before,After).
```

```
next_success(A):-  
    \+ correct,  
    true_success(A).
```

```
correct:-  
    true_count(N),  
    \+ divisible(N,5),  
    \+ divisible(N,3),  
    does_player_say(N).
```

```
correct:-  
    true_count(N),  
    divisible(N,15),  
    does_player_say(fizzbuzz).
```

```
correct:-  
    true_count(N),  
    divisible(N,3),  
    \+ divisible(N,5),  
    does_player_say(fizz).
```

```
correct:-  
    true_count(N),  
    divisible(N,5),  
    \+ divisible(N,3),  
    does_player_say(buzz).
```

# Results

| Metric | Baseline | Inertia | Mean | KNN <sub>1</sub> | KNN <sub>5</sub> | Aleph | ASPAL | Metagol | ILASP*    |
|--------|----------|---------|------|------------------|------------------|-------|-------|---------|-----------|
| BA (%) | 48       | 56      | 64   | 80               | 80               | 66    | 55    | 69      | <b>86</b> |
| PS (%) | 4        | 4       | 15   | 16               | 19               | 18    | 10    | 34      | <b>40</b> |

# Results

| <b>Metric</b> | <b>Aleph</b> | <b>ASPAL</b> | <b>Metagol</b> | <b>ILASP*</b> |
|---------------|--------------|--------------|----------------|---------------|
| BA (%)        | 66           | 55           | 69             | <b>86</b>     |
| PS (%)        | 18           | 10           | 34             | <b>40</b>     |

## Results balanced accuracy

| Approach | goal      | legal     | next      | terminal  |
|----------|-----------|-----------|-----------|-----------|
| True     | 47        | 56        | 47        | 42        |
| Inertia  | 47        | 56        | 80        | 42        |
| Mean     | 82        | 61        | 62        | 53        |
| Knn1     | <b>92</b> | 78        | 86        | 63        |
| Knn5     | <b>92</b> | 79        | 86        | 64        |
| Aleph    | 83        | 60        | 59        | 60        |
| ASPAL    | 52        | 59        | 50        | 59        |
| Metagol  | 74        | 66        | 60        | 77        |
| Ilasp    | <b>92</b> | <b>86</b> | <b>88</b> | <b>80</b> |
| Mean     | 73        | 67        | 69        | 60        |

# Results perfectly solved

| Approach         | goal      | legal     | next      | terminal  |
|------------------|-----------|-----------|-----------|-----------|
| True             | 0         | 16        | 0         | 0         |
| Inertia          | 0         | 16        | 0         | 0         |
| Mean             | 32        | 16        | 0         | 12        |
| Knn <sub>1</sub> | 34        | 16        | 0         | 12        |
| Knn <sub>5</sub> | 34        | 22        | 0         | 18        |
| Aleph            | 32        | 18        | 4         | 16        |
| ASPAL            | 4         | 18        | 0         | 18        |
| Metagol          | <b>48</b> | 28        | 6         | <b>52</b> |
| ILASP            | 46        | <b>44</b> | <b>18</b> | <b>52</b> |
| Mean             | 26        | 22        | 3         | 20        |

# Why?

- Diverse games
- New problems each year
- Independent language
- Hard problems

**IGGP competition?**