

AI::CBR
Case-Based Reasoning
For Perl

Darko Obradovic

AI::CBR

Case-Based Reasoning for Perl

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Kaiserslautern.pm

**Kaisers
Lautern**  **Perl
mongers**

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Another Vietnam?

Ed Timms
Dallas Morning News
1995



Artificial Intelligence?

AI is the mimicking of human thought and cognitive processes to solve complex problems automatically.

(one definition amongst many)

Case-Based Reasoning

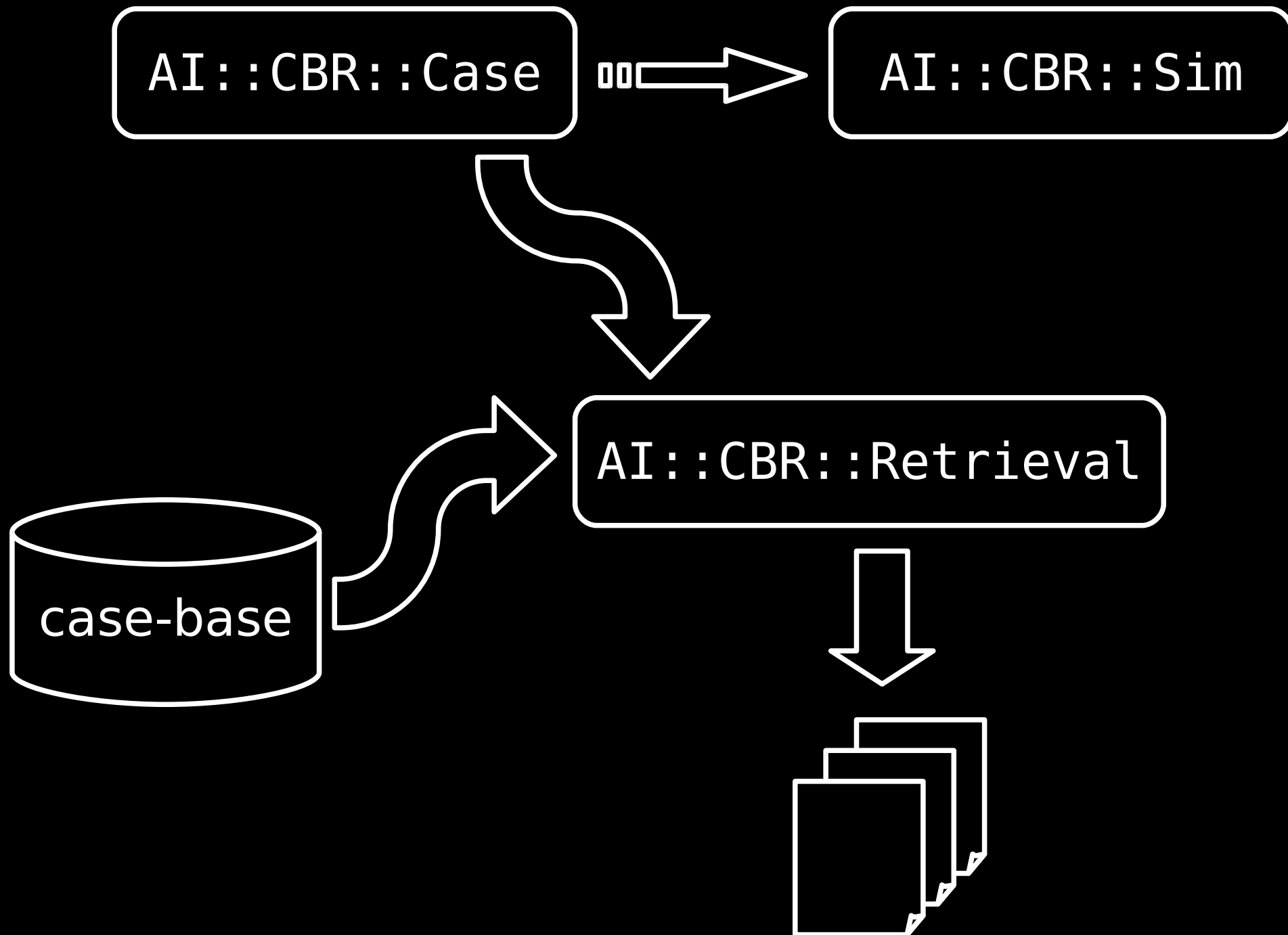


Foundations:
Roger Schank 1977/1983

1. new problem = new case
2. experience = case-base
3. remembering = retrieval
4. apply to new problem = reuse
5. observe & learn = revise
6. memorise = retain

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AI::CBR



An example!



```
# the case
{
  age      => 40,
  gender   => 'male',
  job      => 'programmer',
  symptoms => ['headache',
              'cough'],
}
```

`$diagnosis = ?`

It's all about similarity!

compare two objects A and B
on attribute level
with similarity functions:

$$sim_1 = sim(att_A_1, att_B_1)$$
$$sim_2 = sim(att_A_2, att_B_2)$$

...

$$sim_n = sim(att_A_n, att_B_n)$$

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with similarity functions:

$$sim_1 = sim(\$att_A_1, \$att_B_1)$$
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...

$$sim_n = sim(\$att_A_n, \$att_B_n)$$

similarity values are between 0 and 1

- 0.0 is no similarity at all
- 1.0 is equality

the overall similarity
between two objects A and B
is the mean value
of their attribute's similarities:

$$\$sim_{A_B} = \left(\begin{array}{l} \$sim_1 + \$sim_2 + \dots + \$sim_n \\ \end{array} \right) / n;$$

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```
use CBR::AI::Sim qw(sim_eq sim_frac sim_set);
```

```
# for symbolic values
```

```
sim_eq('programmer', 'programmer'); # 1.0
```

```
sim_eq('programmer', 'manager');    # 0.0
```

```
use CBR::AI::Sim qw(sim_eq sim_frac sim_set);

# for symbolic values
sim_eq('programmer', 'programmer'); # 1.0
sim_eq('programmer', 'manager');    # 0.0

# for numbers
# fraction of the smaller wrt the greater
sim_frac(2, 4);    # 0.5
sim_frac(40, 30); # 0.75
```

```
use CBR::AI::Sim qw(sim_eq sim_frac sim_set);

# for symbolic values
sim_eq('programmer', 'programmer'); # 1.0
sim_eq('programmer', 'manager');    # 0.0

# for numbers
# fraction of the smaller wrt the greater
sim_frac(2, 4);    # 0.5
sim_frac(40, 30); # 0.75

# for sets/lists of symbolic values
# |intersection elements| / |union elements|
sim_set([qw(a b c d)], ['a']);    # 0.25
sim_set([qw(a b c)], [qw(b c d)]); # 0.5
```



```
# the case
{
  age      => 40,
  gender   => 'male',
  job      => 'programmer',
  symptoms => ['headache',
              'cough'],
}
```

`$diagnosis = ?`

case definition

```
use AI::CBR::Case;
use AI::CBR::Sim qw(
    sim_eq sim_frac sim_set
);
```

```
my $new_case = AI::CBR::Case->new(
    age      => { sim => \&sim_frac },
    gender   => { sim => \&sim_eq   },
    job      => { sim => \&sim_eq   },
    symptoms => { sim => \&sim_set  },
);
```

set case values

```
$new_case->set_values(  
  age      => 40,  
  gender   => 'male',  
  job      => 'programmer',  
  symptoms => ['headache', 'cough'],  
);
```

```
# case definition and values  
# could have been done in one step
```


fetch case-base

```
use DBIx::Simple;
my $db = DBIx::Simple->new(...);

my @case_base = $db->query(
    SELECT age, gender, job, symptoms,
           diagnosis
    FROM patients
)->hashes();

foreach @case_base {
    $_->{symptoms} = [split ' ', $_->{symptoms}]
}
```

retrieve most similar case

```
use AI::CBR::Retrieval;

my $r = AI::CBR::Retrieval->new(
    $new_case, [@case_base]
);
$r->compute_sims();

my $solution = $r->most_similar_candidate();
print $solution->{diagnosis};
```

```
# in case-base
```

```
{
```

```
  age      => 28,
```

```
  gender   => 'male',
```

```
  job      => 'programmer',
```

```
  symptoms => ['headache'],
```

```
  diagnosis => 'hangover',
```

```
}
```



```
# for age:  
sim_frac(40, 28) # 0.7
```

```
# for age:  
sim_frac(40, 28) # 0.7  
# for gender:  
sim_eq('male', 'male') # 1.0
```

```
# for age:  
sim_frac(40, 28) # 0.7  
# for gender:  
sim_eq('male', 'male') # 1.0  
# for job:  
sim_eq('programmer', 'programmer') # 1.0
```

```
# for age:  
sim_frac(40, 28) # 0.7  
# for gender:  
sim_eq('male', 'male') # 1.0  
# for job:  
sim_eq('programmer', 'programmer') # 1.0  
# for symptoms:  
sim_set(['headache', 'cough'], ['headache'])  
# 0.5
```

```
# for age:  
sim_frac(40, 28) # 0.7  
# for gender:  
sim_eq('male', 'male') # 1.0  
# for job:  
sim_eq('programmer', 'programmer') # 1.0  
# for symptoms:  
sim_set(['headache', 'cough'], ['headache'])  
# 0.5  
  
$sim = 3.2 / 4; # 0.8
```



```
# for age:  
sim_frac(40, 28) # 0.7  
# for gender:  
sim_eq('male', 'male') # 1.0  
# for job:  
sim_eq('programmer', 'programmer') # 1.0  
# for symptoms:  
sim_set(['headache', 'cough'], ['headache'])  
# 0.5
```

```
$sim = 3.2 / 4; # 0.8
```

```
$diagnosis => 'hangover'!
```

What else can you do?

Similarity Functions

- define your own ones!
 - there are millions of different use-cases
 - flexibility with optional parameter

Similarity Functions

- define your own ones!
 - there are millions of different use-cases
 - flexibility with optional parameter
- code them in C
 - most efficient tuning

Retrieval

- multiple methods:
 - `most_similar_candidate()`
 - `n_most_similar_candidates($n)`
 - `first_confirmed_candidate('diagnosis')`

Retrieval

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 - `most_similar_candidate()`
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 1. Hangover
 2. Stress
 3. Whiplash Injury
 4. Stress
 5. ...

Retrieval

- multiple methods:
 - `most_similar_candidate()`
 - `n_most_similar_candidates($n)`
 - `first_confirmed_candidate('diagnosis')`
 1. Hangover
 2. **Stress**
 3. Whiplash Injury
 4. Stress
 5. ...

Retrieval

- multiple methods:
 - `most_similar_candidate()`
 - `n_most_similar_candidates($n)`
 - `first_confirmed_candidate('diagnosis')`
 1. Hangover
 2. Stress
 3. Whiplash Injury
 4. Stress
 5. ...
- subclass & extend!

Intelligent Product Retrieval



Home

Buy

Sell

Research

Shopping Advice

Year

All
1995
1994
1993
1992

💡 Looking for older or classic cars?

[Use our 1982 and older search.](#)

Price Range

\$0 to No Maxim

Mileage Range

0 to No Maxim

Search within

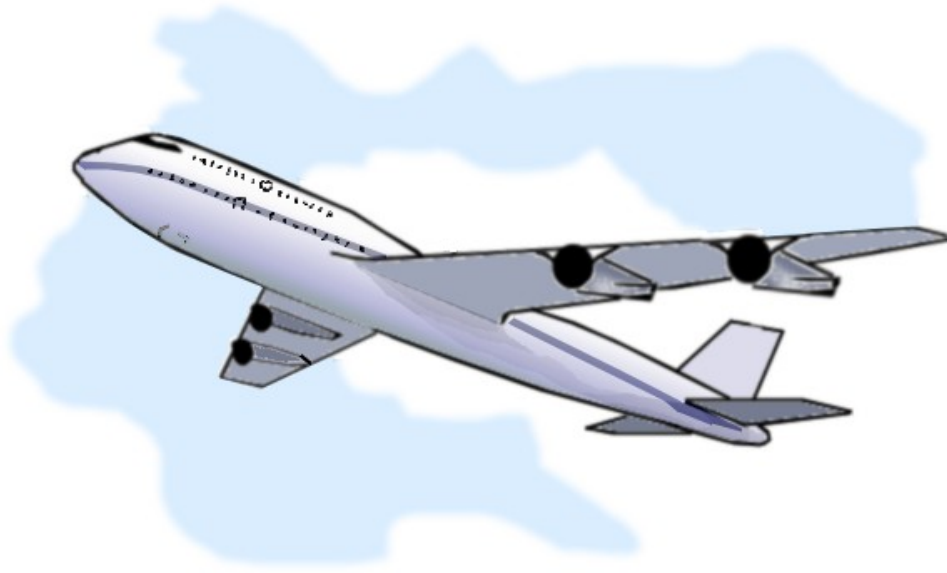
30 miles of ZIP Code

— OR —

Choose a City

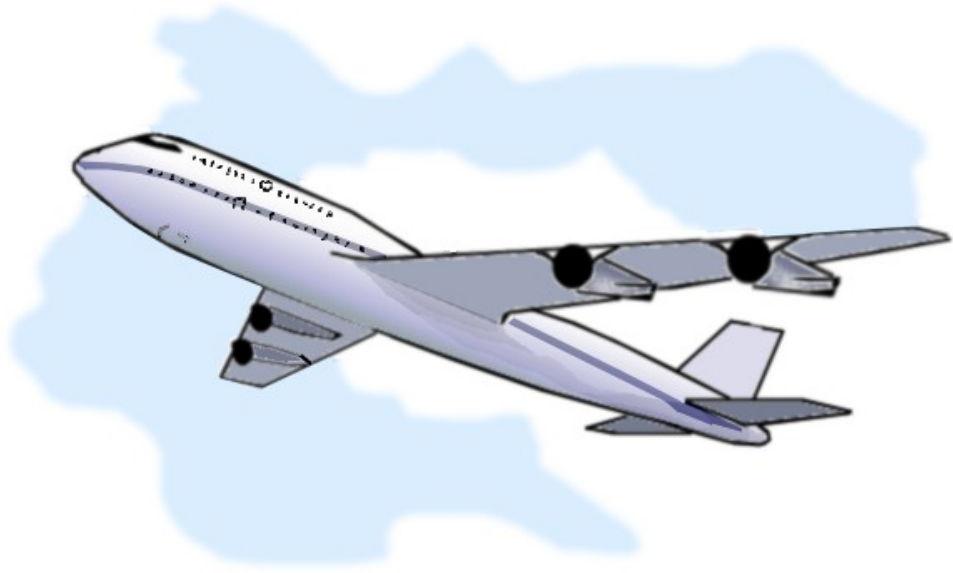
1. query = new case
2. products = case-base
3. search = retrieval

Compound Cases



Trip





0.9

Trip

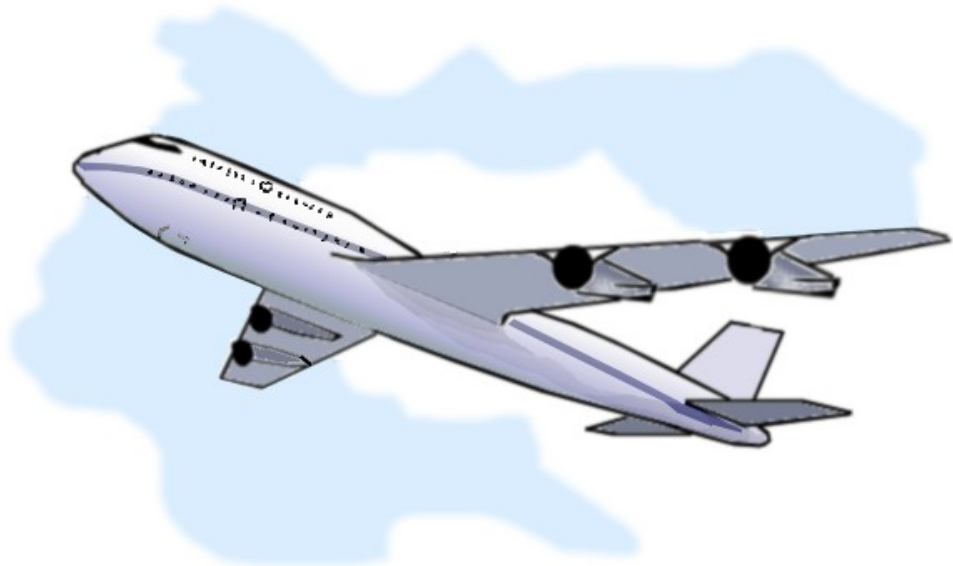


0.9



0.9

0.9



0.9

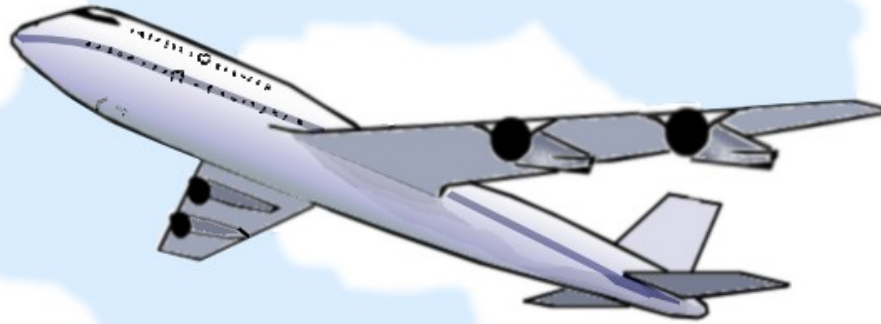
Trip



0.9



0.9



0.9

Trip



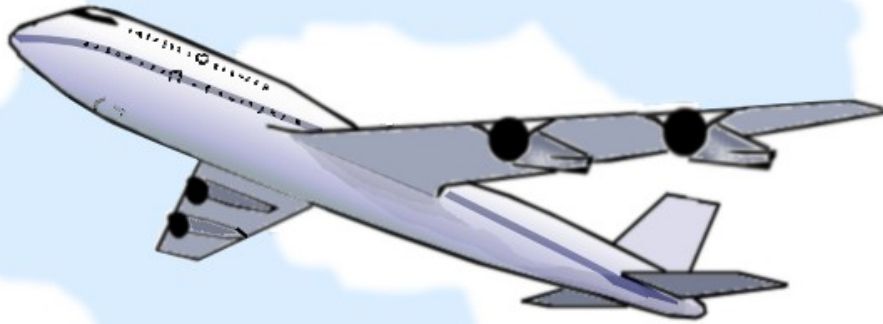
0.9



0.1

0.63

?



0.9

Trip



0.9



0.1

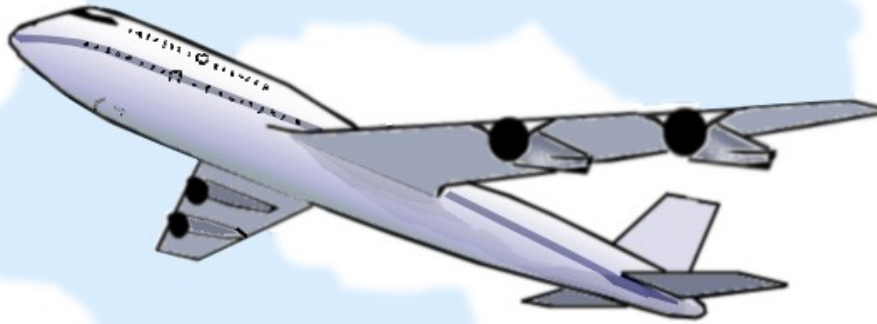
Compound Case

```
use AI::CBR::Case::Compound;
```

```
my $case = AI::CBR::Case::Compound->new([  
    $flight_spec,  
    $hotel_spec,  
    $destination_spec,  
]);
```

```
$sim = nroot(3,    $sim_flight  
                * $sim_hotel  
                * $sim_destination);
```

0.43



0.9

Trip



0.9

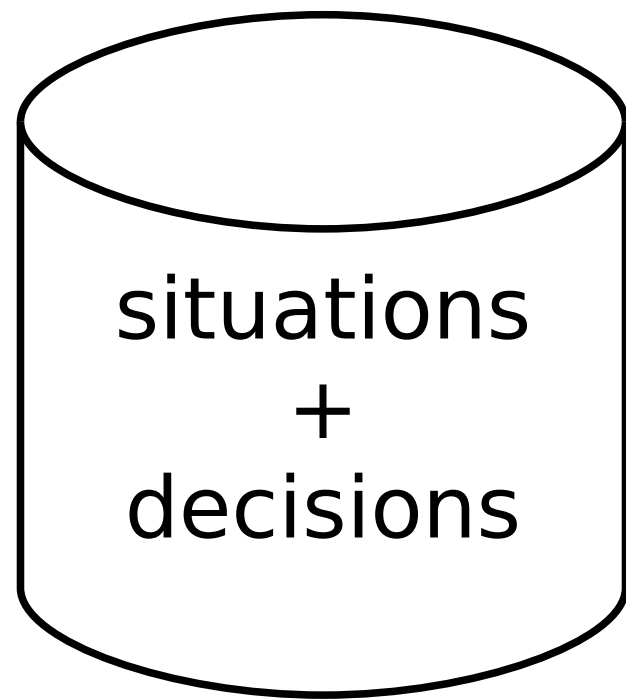
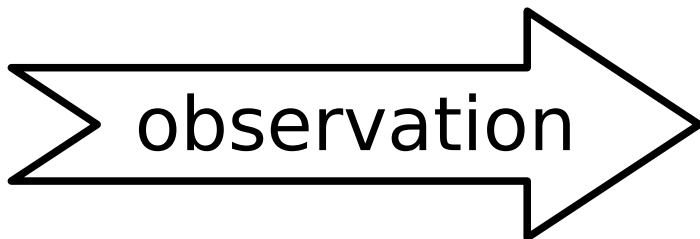


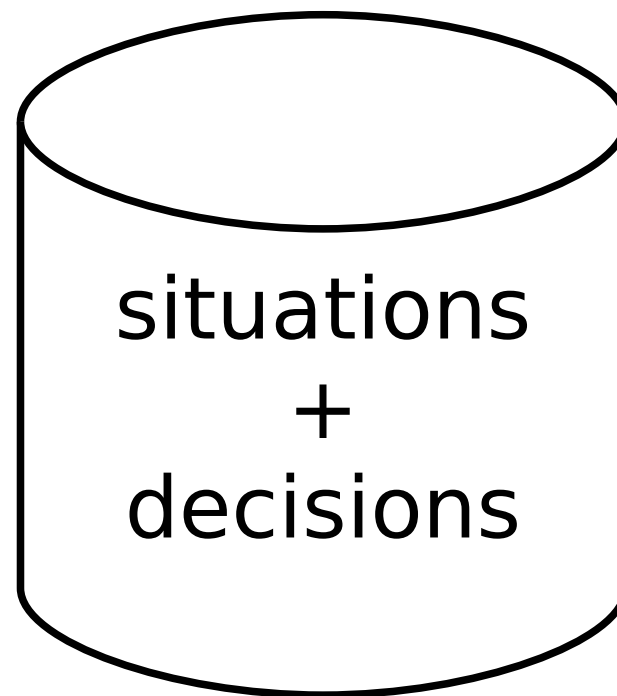
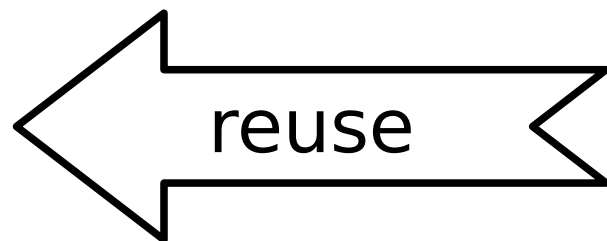
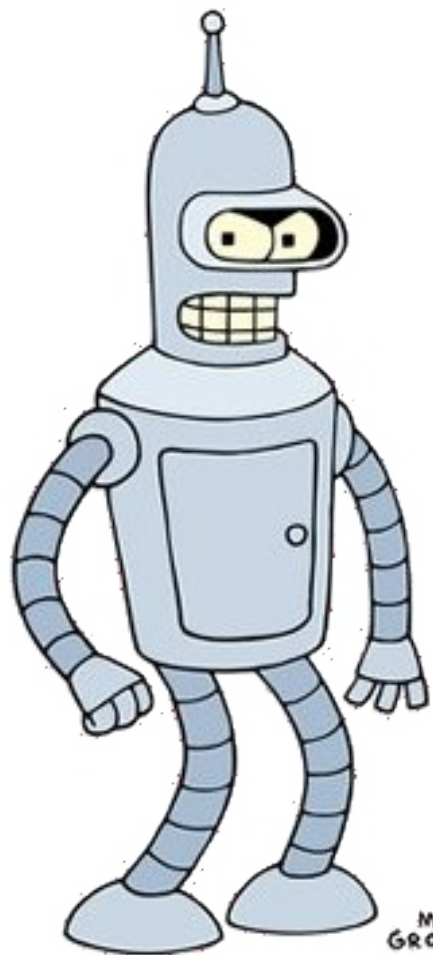
0.1

What did you do with it?

CYBORG

AI for a strategy game





Conclusions

- observed 15-30 games per player
- thousands of comparisons per turn
 - ~400 turns per game
- system performance ok
- AI performance good
- for details, see homepage

The End

Thank you!

Questions?

matrix similarity function

```
my $os_matrix = {  
  linux => { mac => 0.8, win => 0.2 },  
  mac   => { linux => 0.8, win => 0.5 },  
  win   => { linux => 0.2, mac => 0.5 },  
};
```

```
$new_case = AI::CBR::Case->new(  
  os => { sim => \&sim_matrix,  
    param => $os_matrix },  
  ...  
);
```

matrix similarity function

```
sub sim_matrix {  
  my ($a, $b, $matrix) = @_;  
  return 1 if $a eq $b;  
  return $matrix->{$a}->{$b};  
}
```