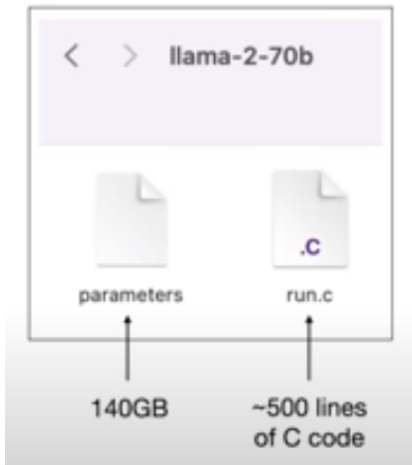


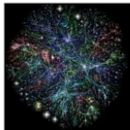
An open source large language model



From A.Karpathy

Training them is more involved.

Think of it like compressing the internet.



Chunk of the internet,
~10TB of text



6,000 GPUs for 12 days, ~\$2M
~1e24 FLOPS



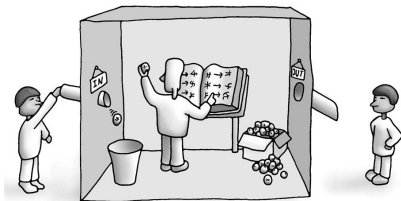
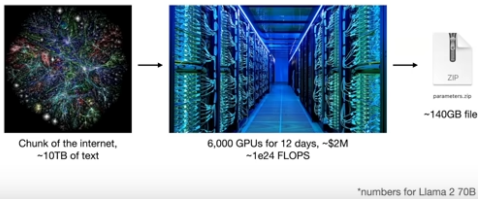
parameters.zip
~140GB file

*numbers for Llama 2 70B



Training them is more involved.

Think of it like compressing the internet.

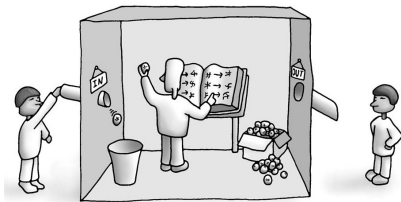


Mindless obedience

From <http://america.pink/images/9/6/3/2/5/4/en/2-chinese-room.jpg>

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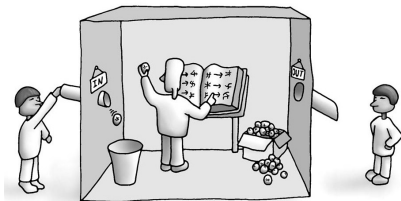
Mindless obedience

HP: does P halt on D ?

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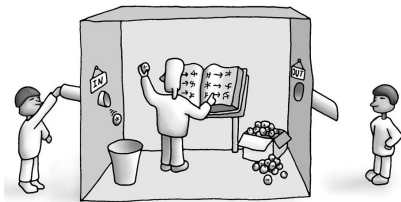
Semi-solvable:

run P on D ;

return 1.

Training them is more involved.

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From <http://america.pink/images/9/6/3/2/5/4/en/2-chinese-room.jpg>

Mindless obedience

HP: does P halt on D ?

Semi-solvable:
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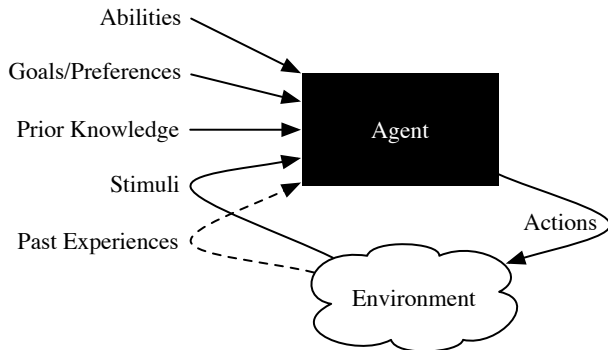
$\text{run} \approx \text{run.c}, \quad U, \text{ accept}$

$P \approx \text{parameters, TM, fsm}$

Fsm exercise: solution

```
accept(_,Final,Q,[]) :-
```

```
accept(Trans,Final,Q,[H|T]) :-
```



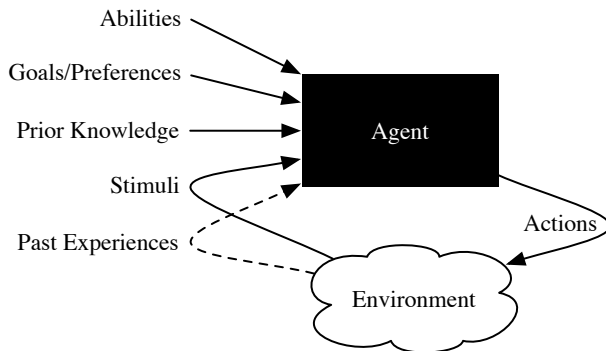
Fsm exercise: solution

```
accept(_,Final,Q,[]) :- member(Q,Final).
```

```
accept(Trans,Final,Q,[H|T]) :-
```

```
member(X,[X|_]).
```

```
member(X,[_|L]) :- member(X,L).
```



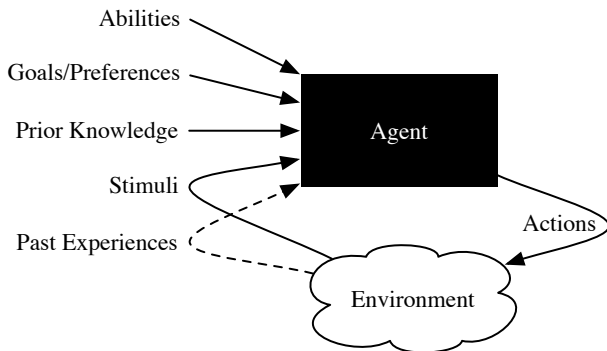
Fsm exercise: solution

```
accept(_,Final,Q,[]) :- member(Q,Final).
```

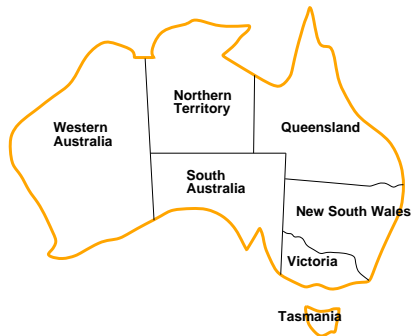
```
accept(Trans,Final,Q,[H|T]) :-  
    member([Q,H,Qn],Trans),  
    accept(Trans,Final,Qn,T).
```

```
member(X,[X|_]).
```

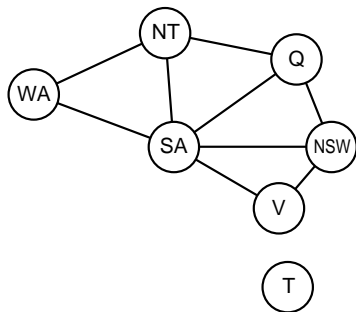
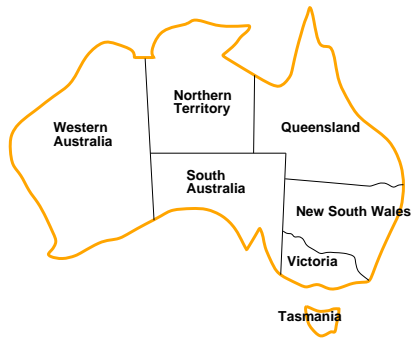
```
member(X,[_|L]) :- member(X,L).
```



Graph modeling

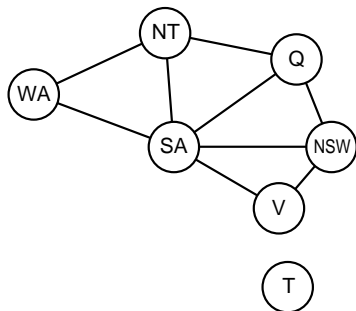
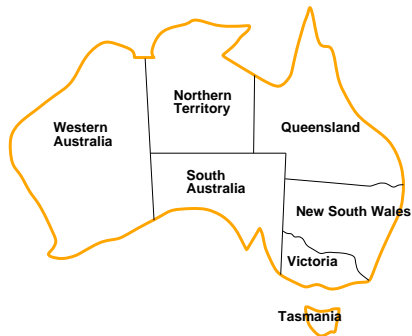


Graph modeling



Russell & Norvig

Graph modeling



Russell & Norvig

```
ar(wa,nt).  ar(nt,q).  ar(q,nsw).  
ar(nsw,v).  ar(wa,sa).  ar(sa,nsw).  
ar(nt,sa).  ar(sa,v).  ar(sa,q).  
arc(X,Y) :- ar(X,Y) ; ar(Y,X).
```

Search (in Prolog)

Given goal, arc

```
search(Node) :- goal(Node).
```

```
search(Node) :- arc(Node,Next), search(Next).
```

Search (in Prolog)

Given goal, arc

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Example: accept(Trans,Final,Q0,String)

```
Node as [Q,UnseenString]
```

Search (in Prolog)

Given goal, arc

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```
search(Node) :- arc(Node,Next), search(Next).
```

Example: accept(Trans,Final,Q0,String)

```
Node as [Q,UnseenString]
```

```
goal([Q,[]],Final) :- member(Q,Final).
```

Search (in Prolog)

Given goal, arc

```
search(Node) :- goal(Node).
```

```
search(Node) :- arc(Node,Next), search(Next).
```

Example: accept(Trans,Final,Q0,String)

```
Node as [Q,UnseenString]
```

```
goal([Q,[]],Final) :- member(Q,Final).
```

```
arc([Q,[H|T]],[Qn,T],Trans) :-  
    member([Q,H,Qn],Trans).
```


Search (in Prolog)

Given goal, arc

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Example: accept(Trans,Final,Q0,String)

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    search(Next,Fi,Tr).
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```
Node as [Q,UnseenString]
```

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```

```
search(Node,Final,_) :- goal(Node,Final).
```

```
search(Node,Fi,Tr) :- arc(Node,Next,Tr),  
    search(Next,Fi,Tr).
```

```
accept(Tr,Fi,Q0,S) :- search([Q0,S],Fi,Tr).
```

Prolog as search

i :- p,q.

i :- r.

p.

r.

| ?- i.

Prolog as search

i :- p,q. [i]

i :- r.

p.

r.

| ?- i.

StartNode = [i]

Prolog as search

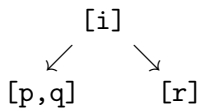
`i :- p,q.`

`i :- r.`

`p.`

`r.`

`| ?- i.`



StartNode = [i]

Prolog as search

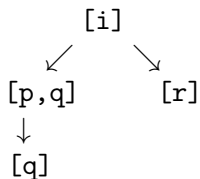
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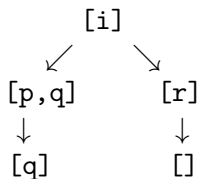
`i :- p,q.`

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StartNode = [i]

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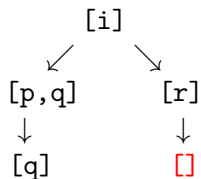
`i :- r.`

`p.`

`r.`

`| ?- i.`

`yes`



`StartNode = [i]`

`goal([]).`

Prolog as search

`i :- p,q.`

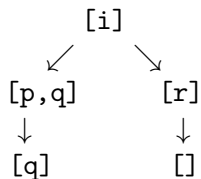
`i :- r.`

`p.`

`r.`

`| ?- i.`

`yes`



`StartNode = [i]`

`goal([]).`

`prove(Node) :- goal(Node) .`

`prove(Node) :- arc(Node,Next), prove(Next).`

KB and arc

$i :- p, q.$

$i :- r.$

$p.$

$r.$

KB and arc

$i :- p, q.$

$[i, p, q]$

$i :- r.$

$[i, r]$

$p.$

$[p]$

$r.$

$[r]$

KB and arc

$i :- p, q.$

$[i, p, q]$

$i :- r.$

$[i, r]$

$p.$

$[p]$

$r.$

$[r]$

$KB = [[i, p, q], [i, r], [p], [r]]$

KB and arc

i :- p,q. [i,p,q]

i :- r. [i,r]

p. [p]

r. [r]

KB = [[i,p,q],[i,r],[p],[r]]

arc(Node1,Node2,KB) :- ??

KB and arc

i :- p,q. [i,p,q]

i :- r. [i,r]

p. [p]

r. [r]

KB = [[i,p,q],[i,r],[p],[r]]

arc([H|T],N,KB) :- member([H|B],KB), append(B,T,N).

KB and arc

i :- p,q. [i,p,q]

i :- r. [i,r]

p. [p]

r. [r]

KB = [[i,p,q],[i,r],[p],[r]]

arc([H|T],N,KB) :- member([H|B],KB), append(B,T,N).

prove(Node,KB) :- goal(Node) ;
arc(Node,Next,KB), prove(Next,KB).

Non-termination (due to poor choice)

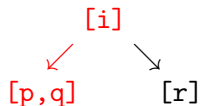
`i :- p,q.`

`i :- r.`

`p :- i.`

`r.`

`| ?- i.`



`prove([],_).`

`prove([H|T],KB) :- member([H|B],KB), append(B,T,Next),
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`| ?- prove([i],[[i,p,q],[i,r],[p,i],[r]]).`

Non-termination (due to poor choice)

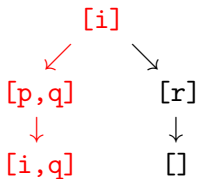
`i :- p,q.`

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`p :- i.`

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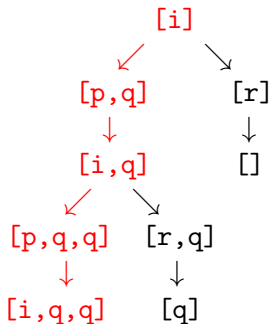
`i :- p,q.`

`i :- r.`

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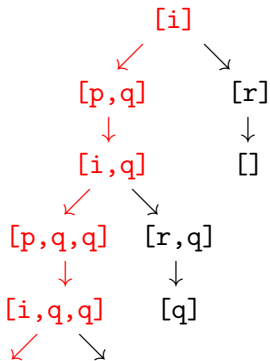
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`i :- r.`

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`r.`

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Determinization (do all)

A fsm $[Trans, Final, Q_0]$ such that

for all $[Q, X, Q_n]$ and $[Q, X, Q_n']$ in Trans, $Q_n = Q_n'$

is a *deterministic finite automaton* (DFA).

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Fact. Every fsm has a DFA accepting the same language.

Proof: Subset (powerset) construction □

Apply to arc, goal, contra Trans, Final:

```
arcD(NodeList, NextList) :-
```

```
    setof(Next, arcLN(NodeList, Next), NextList).
```

```
arcLN(NodeList, Next) :- member(Node, NodeList),  
                           arc(Node, Next).
```


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```

```
arcLN(NodeList, Next) :- member(Node, NodeList),
```

```
    arc(Node, Next).
```

```
goalD(NodeList) :- member(Node, NodeList), goal(Node).
```

Determinization (do all)

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```

```
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```

```
    arc(Node, Next).
```

```
goalD(NodeList) :- member(Node, NodeList), goal(Node).
```

```
searchD(NL) :- goalD(NL);
```

```
    (arcD(NL, NL2), searchD(NL2)).
```

Determinization (do all)

A fsm [Trans, Final, Q0] such that

for all $[Q, X, Q_n]$ and $[Q, X, Q_{n'}]$ in Trans, $Q_n = Q_{n'}$

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Proof: Subset (powerset) construction

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Apply to arc, goal, contra Trans, Final:

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arcD(NodeList, NextList) :-
```

```
    setof(Next, arcLN(NodeList, Next), NextList).
```

```
arcLN(NodeList, Next) :- member(Node, NodeList),
```

```
    arc(Node, Next).
```

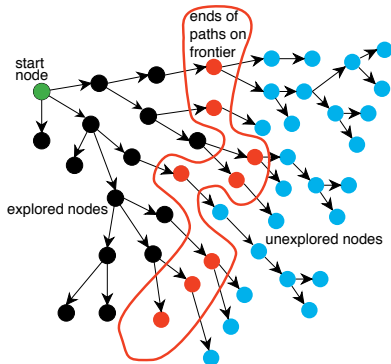
```
goalD(NodeList) :- member(Node, NodeList), goal(Node).
```

```
searchD(NL) :- goalD(NL);
```

```
    (arcD(NL, NL2), searchD(NL2)).
```

```
search(Node) :- searchD([Node]).
```

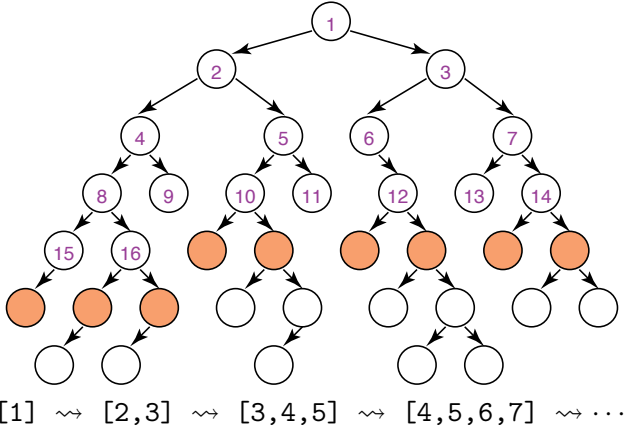
Frontier search (manage choices)



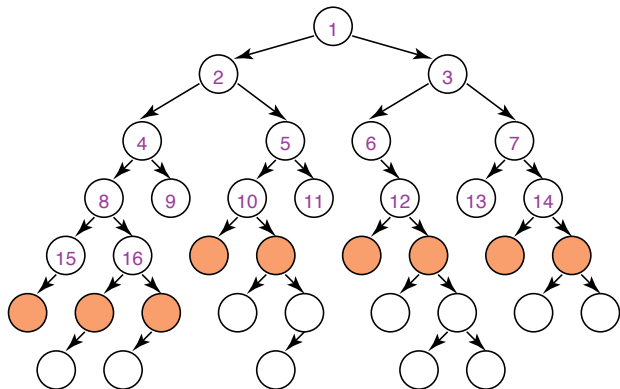
Poole & Mackworth

```
search(Node) :- frontierSearch([Node]).  
frontierSearch([Node|_]) :- goal(Node).  
frontierSearch([Node|Rest]) :-  
    findall(Next, arc(Node,Next), Children),  
    add2frontier(Children,Rest,NewFrontier),  
    frontierSearch(NewFrontier).
```

Breadth-first: queue (FIFO)



Breadth-first: queue (FIFO)



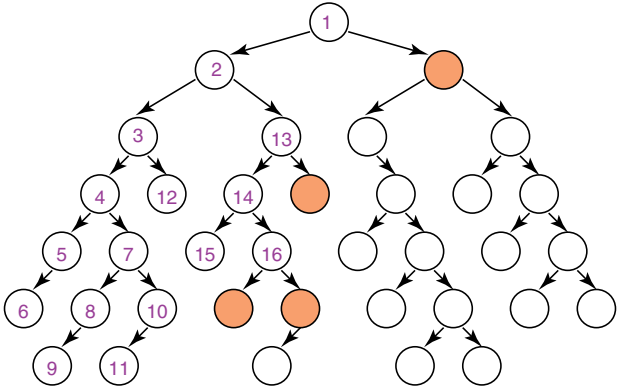
[1] \rightsquigarrow [2,3] \rightsquigarrow [3,4,5] \rightsquigarrow [4,5,6,7] \rightsquigarrow ...

```
add2frontier(Children, [], Children).
```

```
add2frontier(Children, [H|T], [H|More]) :-
```

```
    add2frontier(Children, T, More).
```


Depth-first: stack (LIFO)



[1] \rightsquigarrow [2, •] \rightsquigarrow [3, 13, •] \rightsquigarrow [4, 12, 13, •] \rightsquigarrow ...

```
add2frontier([],Rest,Rest).
```

```
add2frontier([H|T],Rest,[H|TRest]) :-  
    add2frontier(T,Rest,TRest).
```


If-then-else and cut !

$i :- p,!,q.$

$i :- r.$

$p.$

$r.$

$! ?- i.$

If-then-else and cut !

`i :- p,!,q.` `[i]`

`i :- r.`

`p.`

`r.`

`| ?- i.`

If-then-else and cut !

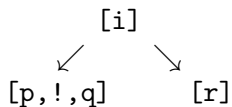
`i :- p,!,q.`

`i :- r.`

`p.`

`r.`

`| ?- i.`



If-then-else and cut !

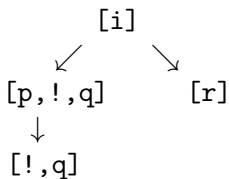
`i :- p,!,q.`

`i :- r.`

`p.`

`r.`

`| ?- i.`



Cut ! is true but destroys backtracking.

If-then-else and cut !

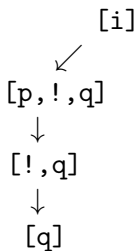
`i :- p,!,q.`

`i :- r.`

`p.`

`r.`

`| ?- i.`



Cut ! is true but destroys backtracking.

If-then-else and cut !

i :- p,!,q.

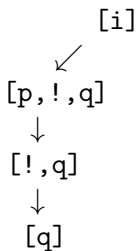
i :- r.

p.

r.

| ?- i.

no



Cut ! is true but destroys backtracking.

Review: Depth-first as frontier search

```
prove([],_).      % goal([]).  
prove(Node,KB) :- arc(Node,Next,KB), prove(Next,KB).
```

Review: Depth-first as frontier search

```
prove([],_).      % goal([]).  
prove(Node,KB) :- arc(Node,Next,KB), prove(Next,KB).
```

```
fs([],_|_,-).
```

```
fs([Node|Rest],KB) :-  
    findall(X,arc(Node,X,KB),Children),  
    append(Children,Rest,NewFrontier),  
    fs(NewFrontier,KB).
```


Review: Depth-first as frontier search

```
prove([],_).      % goal([]).  
prove(Node,KB) :- arc(Node,Next,KB), prove(Next,KB).
```

```
fs([],_).
```

```
fs([Node|Rest],KB) :-  
    findall(X,arc(Node,X,KB),Children),  
    append(Children,Rest,NewFrontier),  
    fs(NewFrontier,KB).
```

Cut?

Tracking the frontier

[[i]]

i :- p,!,q. [i]

i :- r.

p.

r.

| ?- i.

Tracking the frontier

$[[i]] \rightsquigarrow [[p,!,q],[r]]$

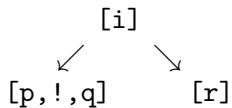
$i :- p,!,q.$

$i :- r.$

$p.$

$r.$

$| \text{?- } i.$



Tracking the frontier

$[[i]] \rightsquigarrow [[p,!,q],[r]] \rightsquigarrow [[!,q],[r]]$

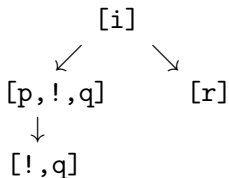
$i :- p,!,q.$

$i :- r.$

$p.$

$r.$

$| ?- i.$



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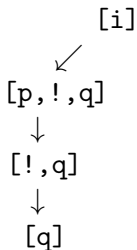
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$[[i]] \rightsquigarrow [[p,!,q],[r]] \rightsquigarrow [[!,q],[r]] \rightsquigarrow [[q]] \rightsquigarrow []$

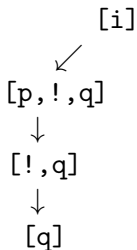
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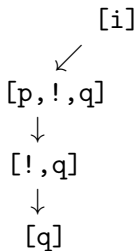
$i :- r.$

$p.$

$r.$

$| ?- i.$

no



Cut via frontier depth-first search

```
fs([],_).
```

```
fs([Node|Rest],KB) :-  
    findall(X,arc(Node,X,KB),Children),  
    append(Children,Rest,NewFrontier),  
    fs(NewFrontier,KB).
```


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```

Cut via frontier depth-first search

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```
if(p,q,r) :- (p,!q); r.      % contra (p,q);r
```

```
negation-as-failure(p) :- if(p,fail,true).
```

Exercise (Prolog)

Suppose a positive integer `Seed` links nodes $1, 2, \dots$ in two ways

`arc(N,M,Seed) :- M is N*Seed.`

`arc(N,M,Seed) :- M is N*Seed +1.`

e.g. `Seed=3` gives arcs $(1,3)$, $(1,4)$, $(3,9)$, $(3, 10)$...

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Goal nodes are multiples of a positive integer `Target`

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Modify frontier search to define predicates

```
breadth1st(+Start, ?Found, +Seed, +Target)
```

```
depth1st(+Start, ?Found, +Seed, +Target)
```

that search breadth-first and depth-first respectively for a `Target`-goal node `Found` linked to `Start` by `Seed`-arcs.