

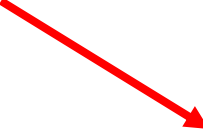
RN, Chapter 10



Implemented Systems



Logical Agents

- Reasoning [Ch 6]
 - Propositional Logic [Ch 7]
 - Predicate Calculus
 - Representation [Ch 8]
 - Inference [Ch 9]
 - **Implemented Systems [Ch 10]**
 - DataBase Systems
 - Prolog + Extensions (MRS)
 - General Theorem Provers
 - Frame Systems
 - Description Languages
 - Truth Maintenance – Retractions
 - Planning [Ch 11]
- 



Properties of Derivation Process

- \vdash_{α} is SOUND

$$\Sigma \vdash_{\alpha} \Psi \Rightarrow \Sigma \models \Psi$$

Produces only “true” results

- \vdash_{α} is COMPLETE

$$\Sigma \vdash_{\alpha} \Psi \Leftarrow \Sigma \models \Psi$$

Produces all “true” results

- \vdash_{α} is DECIDABLE

$\Sigma \stackrel{?}{\vdash}_{\alpha} \Psi$ returns Y or N in finite time



Degenerate \vdash_α

- For any $\Sigma, \Psi \subset \text{WFFs}$:

$$\Sigma \not\vdash_N \Psi$$

$$\Sigma \vdash_P \Psi$$

- Notice:



Degenerate \vdash_α

- For any $\Sigma, \Psi \subset \text{WFFs}$:

$$\Sigma \not\vdash_N \Psi$$

$$\Sigma \vdash_P \Psi$$

- Notice:

- \vdash_N is **SOUND**
(everything it returns is logically entailed)
- \vdash_P is **COMPLETE**
(it returns everything logically entailed)
- \vdash_N, \vdash_P are **DECIDABLE**
(answer every question)



Fundamental Limitation

- For any sufficiently complicated domain (as complex as arithmetic)
- NO \vdash_{α} can be **SOUND, COMPLETE, DECIDABLE!!**
- . . . related to “Halting Problem”
- Not Predicate Calculus' fault:
Reasoning is inherently undecidable,
no matter what formalism used.



Responses

- Deals only with WORST-Case!

“Typical” case can be better

TradeOffs (to increase efficiency):

- ? Sacrifice **SOUNDness**?

? Very severe ??

- ? Sacrifice **COMPLETEness**?

Reasonable... Specific proposals:

- Use only (incomplete set of) Inference Rules
- Use complete set of Inference Rules, but limit depth (stop applying rules...)

- ? Sacrifice **EXPRESSIVENess**?

[EXPRESSIVENess \approx what can be distinguished]

Common approach!

(After all, Logic's distinctions caused problems!)

- Disallow “ \forall ” “ \neg ” “ \exists ” ...



Implemented Systems

- **DataBase Systems**

 - ≈Sound, Complete, Limited Expressiveness

- **Prolog**

 - ≈Sound, Complete, Limited Expressiveness

 - + Extensions: Constraints, MetaLevel aspects:

 - Control, Procedural Attach, Equality, Caching, Direction

- **General Theorem Provers**

 - Sound, Complete, Complete Expressiveness

- **Production System** (Emycin, OPS)

 - ≈Sound, ≈Complete, Limited Expressiveness

- **Frame Systems**

 - ?Sound?, ?Complete?, Limited Expressive

- **Description Languages**

 - Sound, Complete, Limited Expressiveness

- **Truth Maintenance – Retractions**

DataBase Systems

Comp.	Product	Cost/Unit
McD	BigMac	\$1.35
McD	FrenchFry	\$0.80
McD	Ketchup	\$0.01
BurKing	FrenchFry	\$0.80
Lego	Blocks	\$15.00
Army	Tanks	\$50,000.00
Army	Bullets	\$1.00
Navy	Destroyers	\$100,000,000.00
Navy	Torpedos	\$1000.00



```
Makes( mcD, bigMac)      ^ CostUnit( bigMac, $1.35)
Makes( mcD, frenchFry)   ^ CostUnit( frenchFry, $0.80)
Makes( mcD, ketchup)     ^ CostUnit( ketchup, $0.01)
Makes( lego, blocks)     ^ CostUnit( blocks, $15)
Makes( army, tanks)      ^ CostUnit( tanks, $50K)
Makes( army, bullets)    ^ CostUnit( bullets, $1)
Makes( navy, destroyers) ^ CostUnit( destroyers, $100M)
Makes( navy, torpedos)   ^ CostUnit( torpedos, $1000)
```



Comments on DataBase Systems

- Basically set (&) of Positive Ground Atomic Literals
- Hard to Express Partial Knowledge
 - "FooBarInc makes either bicycles or rockets"
 - "FooBarInc does not make torpedos"
 - "FooBarInc does make something"
 - "Some company makes LegBands"
 - "Bicycles cost between \$100 and \$1000"
- No (explicit) General Knowledge
 - "Every large company has a president."
 - "Every large company has a president with salary over \$500,000"
- Efficient Reasoning
 - . . . as Reasoning Fetch + And + Or
 - [Cost metric is # of swaps, not retrievals. . .]*

Standard DB Assumptions

■ Closed World Assumption

- **Q:** "Does McDonalds makes Tanks?"

- **A:** No.

... is really "Unknown". But CWA:

- If σ is a positive literal that could be in DB, but σ is not in DB, then conclude $\neg\sigma$

EG: As $\text{makes}(\text{mcD tanks}) \notin \text{DB}$, conclude $\neg\text{makes}(\text{mcD tanks})$

so, $\text{unknown}(\sigma)$ means $\neg\sigma$!

■ Unique Names Assumption

- **Q:** "How many companies make FrenchFry?"

- **A:** 2.

... could be 1, if $\text{McD}=\text{BurgKing}$!

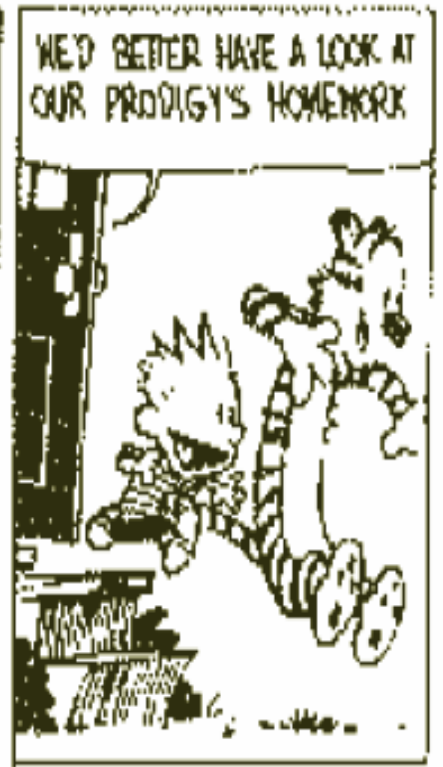
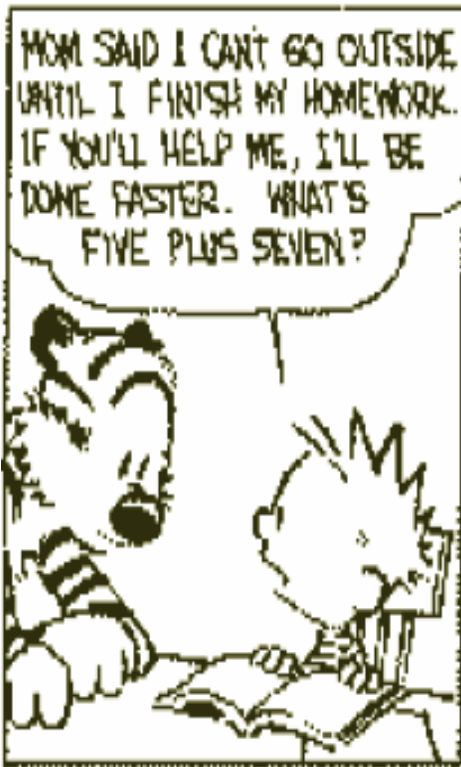
- But UNA:

different names refer to different things.

- So... "How many products does McDonalds make?"

- < 2 unless UNA

- > 3 unless CWA





Prolog

- **Refutation Resolution**
 - so Sound, Complete ... but ...
- Only deals with **Horn clauses**
(≤ 1 positive literal per clause \Rightarrow no REASONING by Cases)
- **Fixed Search Strategy:**
 - Depth first: Prefer resolvent from prior step
 - Left to Right on conjunctions (antecedents)
 - Then chronological, by input (FIFO)
- Efficient in general, but ∞ loops, . . .
- Only Backward Chaining
(No Forward Chaining)
- **No Meta-Level control**
- Difficult to cache, re-use justification, . . .



Prolog's Decisions

Resolution:

Find **two** clauses
w/"matching literals" and
smash them together.

- Q1: *Which two clauses?*

A1: Set-of-Support (Backward)

One clause is query, or descendant;
Other is from KB

- Q2: At any time, "Frontier" of Subgoals.
Which one to work on?

A2: DEPTH-FIRST.

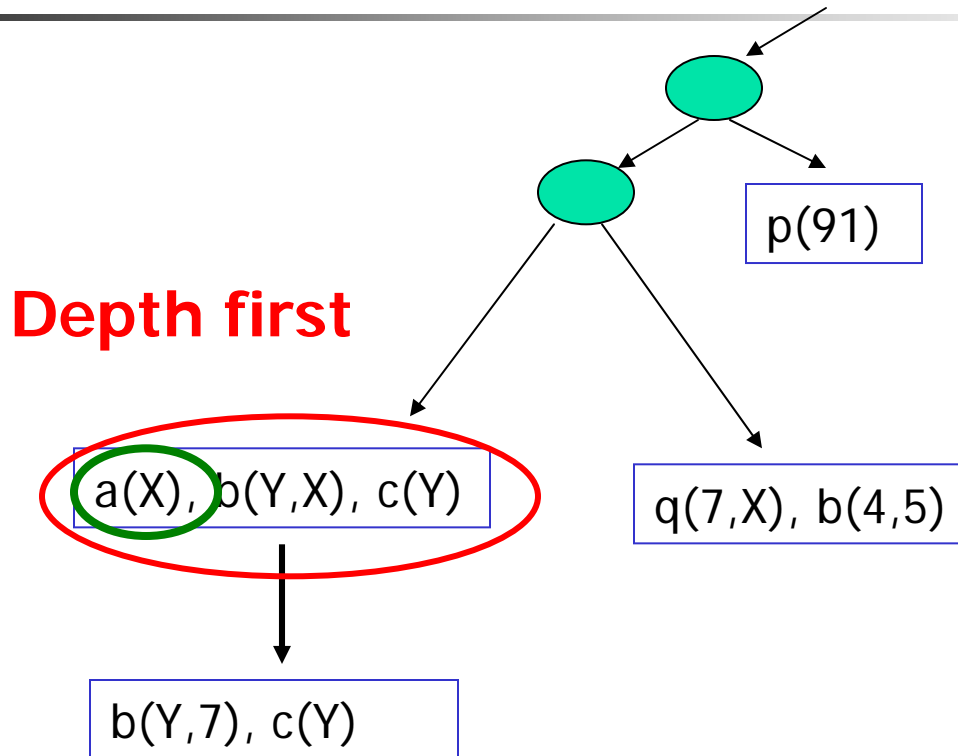
- Q3: *Within subgoal $G = \{ f_1, \dots, f_k \}$, which literals?*

A3: Ordered resolution ... just f_1

- Q4: *Which rule/fact?*

A4: Chronological!

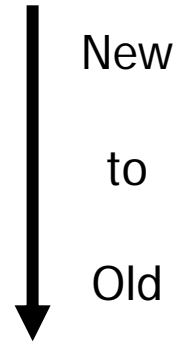
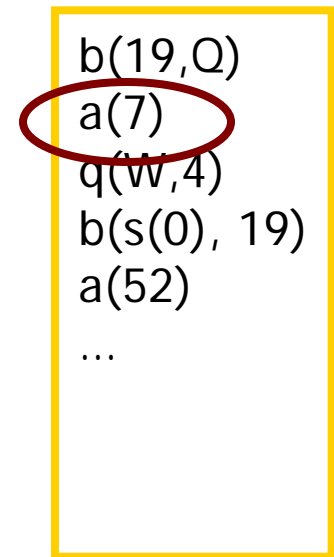
Derivation Process...



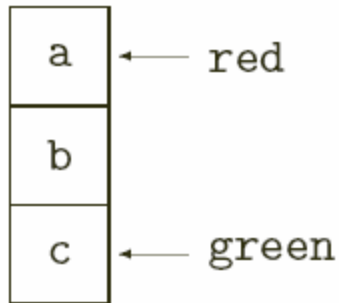
Depth first

Ordered Resolution

Chronological



Limitation of Horn Clauses



$on(a, b)$
 $on(b, c)$
 $red(a)$
 $green(c)$
 $\forall X. red(X) \vee green(X)$

- Question: $\exists X, Y: on(X, Y) \& red(X) \& green(Y)$?
- Yes:
 - b is either red or green
 - If b is red, then $\{ X/b, Y/c \}$
 - If b is green, then $\{ X/a, Y/b \}$
- . . . not in Prolog..
Cannot express $\forall X: red(X) \vee green(X)$



Efficiency Tricks

- No *OccursCheck* ... so $p(X)$ unifies w/ $p(f(X))$

Why?

- Unification w/o *OccursCheck* is $O(n)$ (n = size of clause)
- Unification w/ *OccursCheck* is $O(n^2)$
- \Rightarrow Too many clauses match
- \Rightarrow Too many conclusions reached
- \Rightarrow may conclude [] incorrectly \Rightarrow Not sound!
- Compilation... avoid explicit run-time "Fetch"
- Parallelism:
 - OR-parallelism: different rules
 - AND-parallelism: different literals w/in rule
- Direct binding (single value/variable, on path)
- \Rightarrow > 1M LIPS (Logical Inference per Second)



Prolog's "Impurities"

- **Negation as Failure**

%% Knowledge Base:

```
bach(X) :- male(X), not( married(X) ).  
male(fred).
```

%% Query:

```
?- bach(fred).
```

Yes

- Prolog tries to prove "married(fred)" and fails.

So concludes "not(married(fred)) "

- Control Information – "Cut" !
 - Tells Prolog NOT to backtrack
 - Complicated to explain... see Cmpu325

Extensions to Prolog #I:

Constraints

- Constraint Logic Programs

$\text{triAng}(X,Y,Z) \text{ :- } (X>0), (Y>0), (Z>0),$
 $(X+Y>Z), (Y+Z>X), (X+Z>Y)$

Use#1: confirm $\text{triAng}(3,4,5)$.

Use#2: Constrain $\text{triAng}(X,4,5)?$

Prolog: fail

But. . . $\{ X > 1 \ \& \ X < 9 \}$

- Later use, to constrain other predicates

$\text{triAng}(X,4,5) \ \& \ \text{prime}(X) \ \& \ \dots$

$\text{triAng}(X,4,5) \ \& \ X>100 \ \& \ \dots$

Extensions to Prolog #II: Search Control (for Efficiency)

- Even within Resolution Strategy, ... still decisions:
When to use which literals/clauses?
- For SINGLE query:
 - depends on which variables bound / how
 - Structural information: "No (extra) answers in this path"
 - Conjunct (Rule) Order, How to Backtrack
 - Procedural Attachment, Equality
- Consider DISTRIBUTION D_Q of queries asked of (fixed) KB
 - Best FIXED ordering of rules/conjuncts
 - Best FIXED heuristics ("control rules")

⇒ Save part of derivation, for re-use

 - Caching
 - Explanation-based Learning (macros)
 - Direction of Rules

1a. Conjunct Ordering

- "What is income of president's spouse?"
income(S,I) & married(S,P) & job(P, president)
- Prolog: Enumerate all person/income $\langle S, I \rangle$ pairs
For each S_j in $\langle S_j, I_j \rangle$,
Find spouse(s) P
For each such P, check job(P, president)

10⁶ pairs?

- Silly!
job(P, president) & married(S,P) & income(S,I)

is much more efficient

- Only 1 P, then only 1 S, then only one I

⇒ MetaReasoning:

- Determine #of solutions / literal... seek SMALLEST
- "most constraining conjunct first"
- NP-hard, but \exists good heuristics .. fewest free variables

1b. How to Backtrack?

- “Who lives in same town as president?”

$\text{live}(P, \text{Town}) \ \& \ \text{live}(X, \text{Town}) \ \& \ \text{job}(P, \text{pres})$

- Prolog: Enumerate all person/town $\langle P, \text{Town} \rangle$ pairs

For each Town_j in $\langle P_j, \text{Town}_j \rangle$,

For each x s.t. $\text{live}(x, \text{Town}_j)$

Check $\text{job}(P_j, \text{pres})$

If fail, take next x_2 in Town_j, \dots

- SILLY:

If $\neg \text{job}(P_j, \text{pres})$, should take NEXT town!

ie, backtrack to 1st literal, not 2nd

- Problem: Chronological backtracking

Better: Backjumping

- Which variable led to problem?
- Goto literal that sets that variable

- “Dependency Directed Backtracking”

Store combination of variables that led to dead-end

1c. How to Compute ($> 174\ 50$)?

- Challenge: Determine truth of ($> 174\ 50$)

- Option 1: Explicitly store

($> 51\ 50$) ($> 52\ 50$) ($> 53\ 50$) ($> 54\ 50$)

($> 55\ 50$) ($> 56\ 50$) ($> 57\ 50$) ($> 58\ 50$)

($> 173\ 50$) ($> 174\ 50$) ($> 175\ 50$) ($> 176\ 50$)

($> 2021\ 50$) ($> 2022\ 50$) ($> 2023\ 50$) ($> 2024\ 50$)

and negative facts:

$\neg(> 41\ 50)$ $\neg(> 42\ 50)$ $\neg(> 43\ 50)$ $\neg(> 44\ 50)$

...

as well as

($> 1\ 0$) ($> 2\ 0$) ($> 3\ 0$) ($> 4\ 0$) ...

($> 2\ 1$) ($> 3\ 1$) ($> 4\ 1$) ...

($> 3\ 2$) ($> 4\ 2$) ...

($> 4\ 3$) ...

...

- Requires ∞ storage!
- Is there a better way?



Option 2: Procedural Attachment

- To compute $(> x y)$,
 Use procedure *FetchGT*
 where *FetchGT* returns *Yes* or *No*
- *FetchGT*(σ : proposition)
 if $\text{second}[\sigma] > \text{third}[\sigma]$ then "yes"
 else "no"

Eg: -> (*FetchGT* '($>$ 174 50))

yes

-> (*FetchGT* '($>$ 23 41))

no

Procedural Attachment: +

- Find w s.t. $(+ 10 65 w)$
- Explicit storage: ∞ space!
- Procedure:
To compute $(+ 10 65 w)$, use procedure *FetchPlus* where *FetchPlus* returns appropriate binding list:

```
FetchPlus( $\sigma$  : proposition )
  (Match (caddr ) (+ (cadr ) (caddr )) )
  ;;;          w          10          65
(FetchPlus (+ 10 65 w)) → YES ... w/75
(FetchPlus (+ 10 65 75)) → yes
(FetchPlus (+ 10 65 921)) → no
```

- MRS Solution:
 - MetaTell (ToFetch (> &x &y) FetchGT)
 - MetaTell (ToFetch (+ &x &y &z) FetchPlus)
 - MetaTell (reInproc > >)
 - MetaTell (funproc + +)



Procedural Attachment

- **Why?** (Space) inefficient to store explicitly.
- **What?** Use procedure to solve query.
- **Constraints:** Sound procedure
 - ?Only some bound-sets (directions)?
- **Eg:** $<$, $+$, Sort, . . .
- **Gen'l:** MRS allows user to define how to answer arbitrary **Asked** proposition



1d. Dealing with Equality

- Given axioms
 - russ = profG
 - happy(russ)
 - poor(profG)
 - confused(X) :- happy(X), poor(X).
- Expect to conclude
confused(russ)
- Prolog would not:
 - Reduce confused(russ) to poor(russ) ,
 - but not match poor(russ) w/ poor(profG) .
- ? Could add rule:
poor(Y) :- poor(X), Y=X.

Comments on Equality

```
russ = profG. happy(russ). poor(profG).  
confused(X) :- happy(X), poor(X).
```

- Need rule for each relation, function, ...
- Rule

```
poor(Y) :- poor(X), X=Y.  
would NOT work
```

Reduce confused(russ) to profG = russ,
NOT in knowledge base!

Fix: $\left\{ \begin{array}{l} X=Y :- Y=X. \\ X=X. \\ X=Z :- X=Y, Y=Z. \end{array} \right\}$

or worse:

```
But... poor(billGates)  
      poor(russ), russ=billGates.  
      russ=billGates  
      billGates=russ  
      russ=billGates  
      billGates=russ  
      ...
```

```
russ=billGates  
russ=Y, Y=billGates  
profG=billGates  
profG=Y, Y=billGates  
Y=profG, Y=billGates  
russ=profG, russ=billGates  
russ=billGates  
...
```

- Sol'n: Need lots of control rules!

Wrap-Up wrt Equality

Note: $f(A)$ does NOT unify with $f(B)$,
even if $A = B$

Eg: $\text{Father}(\text{Russ}) = \text{Leonard}$
 $\text{MorningStar} = \text{Venus}$
 $2+2 = 4$

Option#1: View "=" as std predicate

$$\forall x : x = x$$

$$\forall x, y : x = y \Rightarrow y = x$$

$$\forall x, y, z : x = y \wedge y = z \Rightarrow x = z$$

But also need...

$$\forall x, y : x = y \Leftrightarrow P_1(x) = P_1(y)$$

$$\forall x, y : x = y \Leftrightarrow P_2(x) = P_2(y)$$

...

$$\forall x_A, x_B, y_A, y_B : x_A = x_B \wedge y_A = y_B \Leftrightarrow \\ F_1(x_A, y_A) = F_1(x_B, y_B)$$

...

for every predicate

+ search control problems...

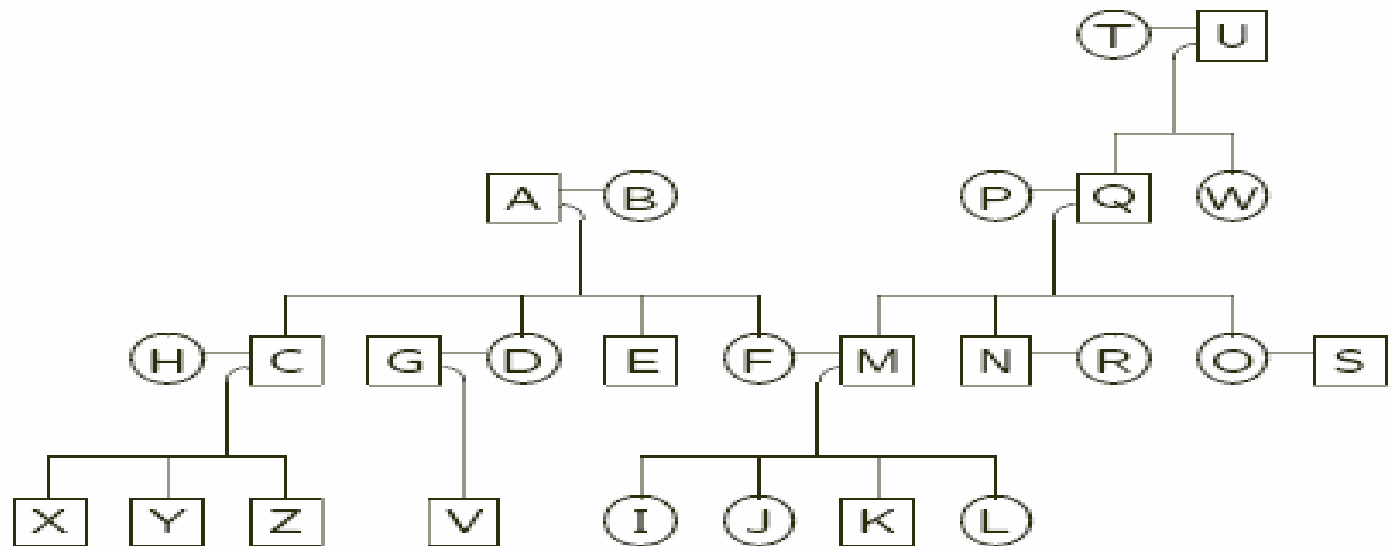
Demodulation: For any terms x, y, z where

$$\text{Unify}(x, z) = \theta:$$

$$\frac{x = y, (\dots z \dots)}{(\dots \text{Subst}(\theta, y) \dots)}$$

Paramodulation: ... do not know $x = y$,
but only " $x = y \vee P(x)$ "

Family Primitive Relationships



`female(F)`

F IS FEMALE.

`male(M)`

M IS MALE.

`mo(E, M)`

M IS THE MOTHER OF E.

`husband(W, H)`

H IS THE HUSBAND OF W.



Definition of (Other) Relations

R1: pa(C, P) :- mo(C, P).

R2: pa(C, P) :- fa(C, P).

R3: sib(E, S) :- pa(E, M), pa(S, M), not(E = S).

R4: sis(E, S) :- sib(E, S), female(S).

R5: bro(E, B) :- sib(E, B), male(B).

R6: aunt(C, A) :- pa(C, P), sis(P, A).

R7: aunt(C, A) :- pa(C, P), bro(P, U), husband(A, U).

female(F)	F is Female.
male(M)	M is Male.
mo(E, M)	M is the MOTHER of E.
husband(W, H)	H is the HUSBAND of W.
fa(E, F)	F is the FATHER of E.
sis(E, S)	S is a SISTER of E.
bro(E, B)	B is a BROTHER of E.
sib(E, S)	S is a SIBLING of E.

2a. Re-Using Information Over Distribution of Queries

- Cache (then re-use) Results
- Eg: cache `aunt(j, e)`
 - Cache (then re-use) Rule-chains
 - Used $\langle R6, R1, R4, R3, R1, R1 \rangle$ to solve `aunt(j, e)`
 - “Chain together” these rule into:
Rn: `aunt(E, A) :- mo(E, M), mo(M, GM), mo(A, GM), female(A), not(M = A).`
 - “Chunking”, “Explanation-Based Learning”, . . .
- “Derivation Path Heuristic”
 - Both `R1` and `R2` reduce `(Pa k p)` goal.
 - Spse `R2` succeeded prior 200 times, and `R1` failed?
Suggests only Fathers; so. . . Try `R2` first, next time!



2b. When to do what?

- Reasoning Agent
 - is **Telled** info
 - is **Asked** questions . . . based on info.
- Here (like Prolog):
 - **Tell** trivial: simple storage
 - **Ask** does ALL the work.
“Backward Chaining”
- But. . . (Production System):
 - **Ask** is trivial: check current KB
 - **Tell** does all the work
“Forward Chaining”
- Which is better?
 - . . . Branching factors
 - Mixed strategies



Forward Chaining

- Compute AUTOMATICALLY
Rather than wait for a question.
- Useful when
 - (1) Same question will be posed many times.
 - (2) single query is expensive:
large (disjunctive) BACKWARD branching.
- Recall Search Space can be
 - Exponential Backwards
 - Linear Forwards

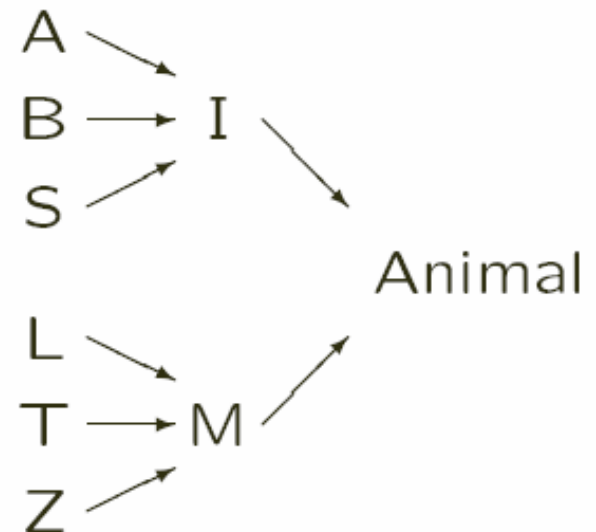
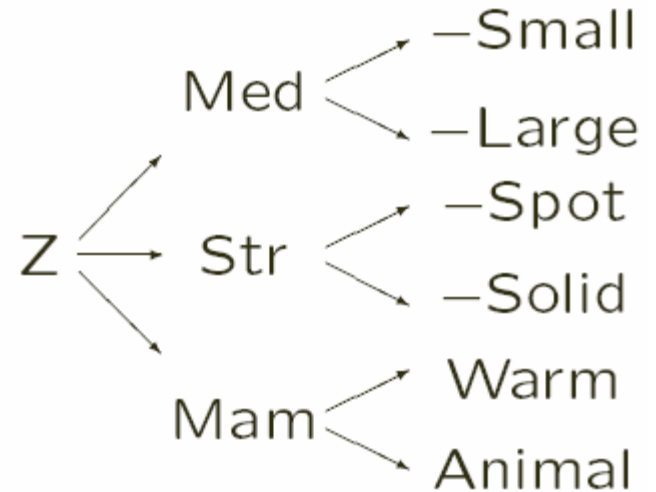
Forward vs Backward Chaining

Query: Animal ?

- KB₁
- Zebra
 - Zebra ⇒ Medium
 - Zebra ⇒ Striped
 - Zebra ⇒ Mammal
 - Medium ⇒ NonSmall
 - Medium ⇒ NonLarge
 - Striped ⇒ NonSolid
 - Striped ⇒ NonSpot
 - Mammal ⇒ Animal
 - Mammal ⇒ Warm
 - ...

- KB₂
- Zebra
 - Ant ⇒ Insect
 - Bee ⇒ Insect
 - Spider ⇒ Insect
 - Insect ⇒ Animal
 - Lion ⇒ Mammal
 - Tiger ⇒ Mammal
 - Zebra ⇒ Mammal
 - Mammal ⇒ Animal...

	FC	BC
KB ₁	9	2
KB ₂	2	8





Forward vs Backward Chaining

- **FC: $KB \mapsto KB'$**
 - Finds other truths
 - No specific query/objective/goal
 - Might conclude irrelevant statements
 - OPS, Interpretation Tasks
- **BC: $KB \times \sigma \mapsto \{ T, F \}$ (w/binding lists)**
 - Determines if query is true
 - Might follow false leads
 - Prolog, Q/Aing, Diagnosis Tasks

≠ Order of Search

I.e., which rules to use, ...



Mixed Forward & Backward Chaining

- Label each rule as *FC* or *BC* or both
(Eg: *R1*, *R2*, *R3* all *FC*; others are *BC*.)
- If all rules matching (if ? ,*p*) are *FC*,
as are rules for antecedents,
then use *Fetch* for *p*:
(MetaTell '(ToAnswer ,*p* Fetch))
[Otherwise: full *BCs*]
- Eg: All (Pa ...) facts ALREADY present
(MetaTell '(ToAnswer (Pa &k &p) Fetch))
- In general, specify:
 - Rule: *FC* and/or *BC*?
 - Ground clause: whether to *FC* when Telled?
... or just store?
 - Query: whether to *BC* on Asked query?
... or just *Fetch*?



Theorem Provers

Goal: Sound, Complete, Complete Expressiveness

Proving theorems from *fixed* data;
no Tells, ...

Inferencing: General, Difficult to Control

- Many like Prolog but...
 - Add “OccursCheck” (to be sound)
 - Include “rewrites”: $x + 0 \mapsto x$
 - Allow real negation $\neg P$
 - Iterative Deepening (not DFS)
 - Linear Resolution + Locking
 - ...

Why? Often used as *PROOF-Checkers*

For verifying ...

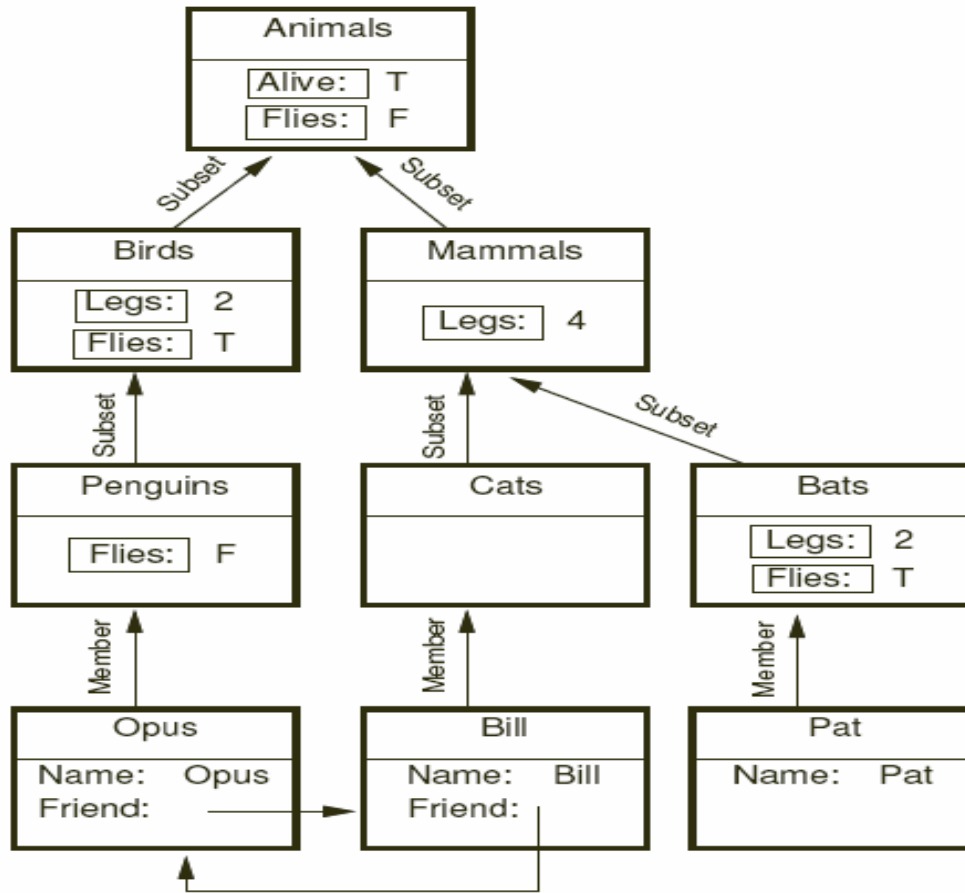
- + hardware circuits (16-bit adder, CPU [timing], ...)
- + software (RSA, B-M string matching, ...)

For synthesis

- automatic programming ... very hard!

(Domains with complete correct axiomatization)

Frame-based Systems



(a) A frame-based knowledge base

Rel(Alive,Animals,T)
Rel(Flies,Animals,F)

Birds \subset Animals
Mammals \subset Animals

Rel(Flies,Birds,T)
Rel(Legs,Birds,2)
Rel(Legs,Mammals,4)

Penguins \subset Birds
Cats \subset Mammals
Bats \subset Mammals
Rel(Flies,Penguins,F)
Rel(Legs,Bats,2)
Rel(Flies,Bats,T)

Opus \in Penguins
Bill \in Cats
Pat \in Bats
Name(Opus,"Opus")
Name(Bill,"Bill")
Friend(Opus,Bill)
Friend(Bill,Opus)
Name(Pat,"Pat")

(b) Translation into first-order logic



Notation for Frame Systems

- Each Cluster is "Unit"
(aka "Frame", "Script", "Schema", . . .)
- Each label is "Slot"
(aka "Aspect", "Attribute", "Function", . . .)
- Value of each unit's slot is "Value"

Eg: **Birds** is Unit

Legs is Slot

2 is Value of Unit:Slot, "**Birds:Legs**"

- Types of Units:
 - Penguins is "Class" type of Unit
 - Opus is "Instance" type of Unit



Use of Frame Systems

1. Begin with skeleton
including "general frame knowledge"
2. Add information by $\left\{ \begin{array}{l} \text{adding new unit} \\ \text{adding new slot} \\ \text{filling in value of slot} \end{array} \right\}$
[+ sometimes by deleting a unit or a slot
or by changing a value]

System may "forward chain" to
add other values. . .

(Usually via "When-Added" procedure)

3. Pose questions by
asking for value of slot of unit.

Finding answer may involve

simply RETRIEVING value, or
COMPUTING by "backward chaining"
"Inheritance" or
COMPUTING via "If-Needed" procedure.



Use of Inheritance

- To answer questions like:
What is name of `Pat`?
Just look up value on `Name` slot of `Pat`.

Note: `Opus` unit does NOT have explicit slot
`Flies`, `Legs`

- To answer questions like:
Does `Opus` fly?
How many legs does `Opus` have?
use `INHERITANCE`

Q: How many legs does `Opus` have?

A: 2

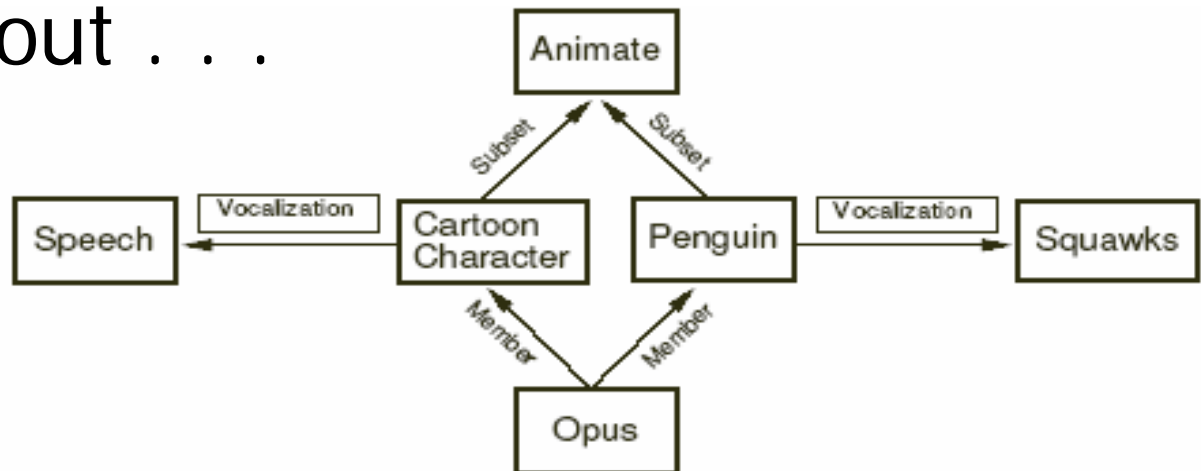
... as `Opus` is member of `Penguins`,
which are subset of `Birds`,
which (typically) have 2 legs.

Multiple Inheritance

- Issue: Does Opus fly?
 - F as $\text{Opus} \in \text{Penguins}$
 - T as $\text{Opus} \in \text{Penguins} \subset \text{Birds}$
- Which to use?

One found *first* (most specific): F

- What about . . .



Wording Frame System within Predicate Calculus

- (Most) Information in ClassUnits translates to rules.

(Eg, "Birds:Covering = Feathers" \rightsquigarrow
 $\forall x. (\text{Bird } x) \Rightarrow (\text{Covering } x \text{ Features})$)

- (Most) Information in InstanceUnits translates to ground atomic facts.

(Eg, "Tweety:Age = 3" \rightsquigarrow (Age Tweety 3)
"Tweety:Flies = Yes" \rightsquigarrow (Flies Tweety))

- Overall information is
CONJUNCTION of these "facts".

Some exceptions:

- While Birds is ClassUnit wrt Tweety
it is an InstanceUnit wrt Species.
- Meta-Information
last access time? who created me?



Expressiveness of Frame Systems

- Easy to express: **Conjunctions of**
 - Rules of form
$$\forall x. (\underline{\text{Class}}\ x) \Rightarrow (\underline{\text{Slot}}\ x\ \underline{\text{Value}})$$
 - Unary, Binary relations
(Eg, (Flies Tweety)
(Child Tweety B7)
(Age Tweety 3))
- Difficult to express
 - Other atomic relations
(Eg "(Between Rock Tweety HardPlace)")
 - Partial Knowledge
 \exists, \neg, \vee

Semantics of Frames

Link Type	Semantics	Example
$A \xrightarrow{\text{Subset}} B$	$A \subset B$	$Cats \subset Mammals$
$A \xrightarrow{\text{Member}} B$	$A \in B$	$Bill \in Cats$
$A \xrightarrow{R} B$	$R(A, B)$	$Bill \xrightarrow{Age} 12$
$A \xrightarrow{\boxed{R}} B$	$\forall x x \in A \Rightarrow R(x, B)$	$Birds \xrightarrow{\boxed{Legs}} 2$
$A \xrightarrow{\boxed{\boxed{R}}} B$	$\forall x \exists y x \in A \Rightarrow y \in B \wedge R(x, y)$	$Birds \xrightarrow{\boxed{\boxed{Parent}}} Birds$

Note: All Birds fly, but
Penguins (which are birds), do not.

- Semantics: \boxed{R} -link from A to B:
Every member of A must have
an R -relation to B
unless \exists intervening A' where $Rel(R, A', B')$

“default value”
nonomonotonic inference
- Issues:
 - + Can “fake” within Predicate Calculus...
 - Multiple inheritance

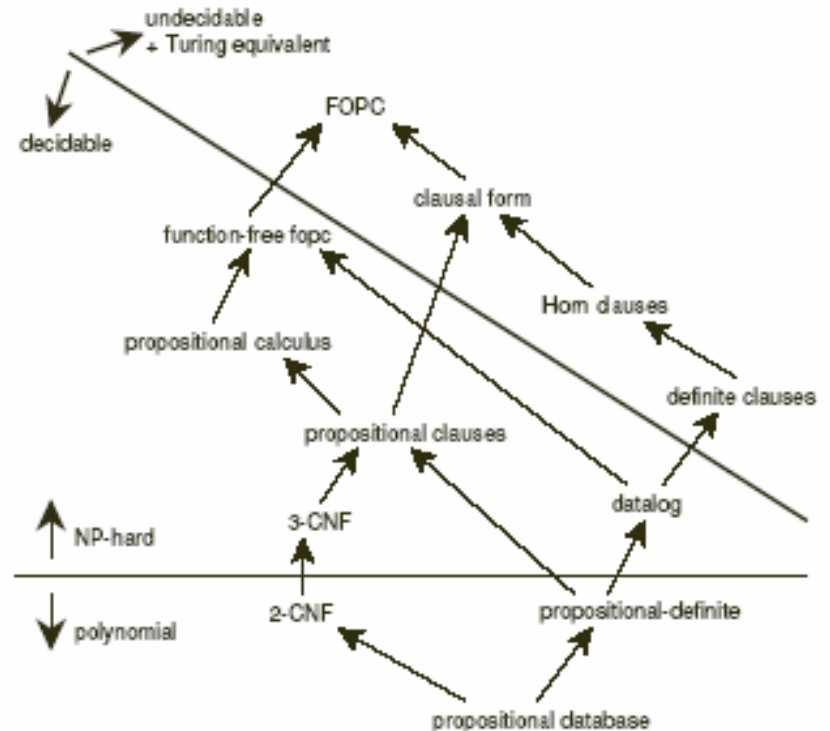


Objectives of Frame Systems

- Core ideas:
 - “Bundle” information together
(Store everything about Birds in one place)
 - Exploit “hierarchy” to obtain “default” answers
 - Cognitive Model
(ie, people store information in similiar form)
[. . . and so is appropriate language for
communicating with people (designers/users). . .]
 - Efficiency
 - Retrieval [“swap in” everything at once]
 - Inferencing [due to limited expressability]
- ≈ same as Semantic Nets...

"Complexity Cliffs"

- Complexity Cliffs:



- Be as expressive as possible within "tractable" side
- Frames/SemanticNets tractable, but not very expressive
- full Predicate Calculus is very expressive but not tractable



Description Logics

- Undecidable if $\forall, \exists, \neg, \vee, \wedge$
- Just use “tractable” subset
eg, avoid \neg , only some types of \vee , ...
- Define concepts

HappyMother \equiv

Woman whose children are all RICH, and all married to pediatricians.

SuccessfulParent \equiv PERSON whose DAUGHTERS are married to doctors.

“Subsumption” questions like:

Is every HappyMother a SuccessfulParent?

What if. . .

at least 3 daughters?

either MDs or Profs?

- Uses: CLASSIC (AT&T)
Financial Management, Database Interfaces, Software Information Systems



Explanation

- Necessary information:
Clauses (Rules, Facts, Constraints) used in derivation
- They are needed for Derivation
(Often required for conclusion)
- Store this info,
associated with conclusion
- ?? Convincing story
 - Just High Points ... not all details
 - Why not another answer?



Retraction

- Tell *adds* new fact φ .

What if φ turns out to be wrong?

... or if want to reclaim space?

... or if world has evolved, making φ irrelevant?

⇒ Need to Retract statement

- $\text{Retract}(\varphi) \not\equiv \text{Tell}(\neg\varphi)$:

After $\text{Tell}(\varphi)$, $\text{Tell}(\neg\varphi)$

KB is INCONSISTENT

After $\text{Retract}(\varphi)$

KB is CONSISTENT, and $\text{Ask}(\varphi) = ??$



Effects of Retraction

- After $\text{Tell}(P)$ and $\text{Tell}(P \Rightarrow Q)$,
agent may (forward-chain to) assert Q

Glitter and Glitter \Rightarrow Gold
assert Gold

If then $\text{Retract}(P)$,
should also $\text{Retract}(Q)$.

- Maybe. . .

Spse also

$\text{Tell}(R)$ and $\text{Tell}(R \Rightarrow Q)$?

Now INDEPENDENT reason to believe Q
 \Rightarrow should NOT retract Q

\Rightarrow Need to maintain REASONS for
believing Q



Truth Maintenance

- Identify with each conclusion Q
the “reason” for believing Q

$\text{Explain}(Q, \{ P, P \Rightarrow Q \})$

- In general, explanation is SET of SETS

$\text{Explain}(Q, \left\{ \left\{ P, P \Rightarrow Q \right\}, \left\{ R, S, R \wedge S \Rightarrow Q \right\} \right\})$

Each element could be

- + Telled fact/clause/rule/...
- + assumption
- + fact reached by forward chaining

- Note after $\text{Tell}(W)$, have $\text{Explain}(W, \{ W \})$

- Each set is “explanation”

Retracting any member of an explanation
removes that explanation

If remove ALL of φ 's explanation

$\text{Retract}(\varphi)$



Comments on Explanation

- “ $\text{Explain}(\varphi, \dots)$ ” explains why agent believes φ
- In general, “explanation” can include
 - + facts in KB
 - + statements NOT in KB (defaults)

Eg: As x is bird, then x flies, unless abnormal_{fly}.
Given Tweety is bird, conclude Tweety flies.

$\text{Explain}(\text{Fly}(\text{Tweety}), \left\{ \begin{array}{l} \text{Bird}(\text{Tweety}) \\ \text{Bird}(x) \wedge \neg \text{Ab}_{\text{fly}}(x) \Rightarrow \text{Fly}(x) \\ \text{“}\neg \text{Ab}_{\text{fly}}(\text{Tweety})\text{”} \end{array} \right\})$

Then learn Tweety is penguin (Ab_{fly})
 \Rightarrow retract $\text{Fly}(\text{Tweety}) \dots$

- Maintain SETS of consistent worlds

Then specify specific world using “in/out”

\Rightarrow Assumption-based Truth Maintenance Systems



Summary

- Reasoning cannot be
 - Sound, Complete & Efficient
 - in complex domains
- Different tradeoffs:
 - Limited Expressibility:
Database, Prolog, Description Logics
 - Incomplete, Unsound
- Which is best?
 - Depends on application, and goals
 - Good to EXPLICIT: why gave up what?