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Lecture 11 – Part I

# Introduction to Functional Programming

# Introduction

$x = x + 1$  (Java) vs.  
 $x = x + 1$  (mathematical equation)

- The design of the **imperative languages** is based directly on the *von Neumann architecture*
  - Efficiency is the primary concern, rather than the suitability of the language for software development
- The design of the **functional languages** is based on *mathematical functions*
  - A solid theoretical basis that is also closer to the user, but relatively unconcerned with the architecture of the machines on which programs will run

# Mathematical Functions

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- A mathematical function is a *mapping* of members of one set, called the *domain set*, to another set, called the *range set*

e.g.  $\text{cube}(x) = x * x * x$

- A *lambda expression* specifies the parameter(s) and the mapping of a function in the following form

$$\lambda(x) \ x * x * x$$

for the function  $\text{cube}(x) = x * x * x$

# Lambda Expressions

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- Lambda expressions describe nameless functions
- Lambda expressions are applied to parameter(s) by placing the parameter(s) after the expression

e.g.,  $(\lambda (x) \ x * x * x) (2)$

which evaluates to 8

e.g. Python

```
>>>(lambda x: x * x * x) (2)
```

```
>>> 8
```

# Functional Forms

---

- A **higher-order function**, or *functional form*, is one that either takes functions as parameters or yields a function as its result, or both

$$\text{HoF } (f, g, x) \equiv f (g(x)+5)$$

# Functional Forms

---

- A **higher-order function**, or *functional form*, is one that either takes functions as parameters or yields a function as its result, or both

$$\text{HoF (f, g, x)} \equiv \text{f (g(x)+5)}$$

function as parameter

# Function Composition

---

- A functional form that takes two functions as parameters and yields a function whose value is the first actual parameter function applied to the application of the second

Form:  $h \equiv f \circ g$

which means  $h(x) \equiv f(g(x))$

For  $f(x) \equiv x + 2$  and  $g(x) \equiv 3 * x$ ,

$h \equiv f \circ g$  yields  $(3 * x) + 2$

Function composition is one (simple)  
type of functional form

# Apply-to-all

---

- A functional form that takes a single function as a parameter and yields a list of values obtained by applying the given function to each element of a list of parameters

Form:  $\alpha$

For  $h(x) \equiv x * x$

$\alpha(h, (2, 3, 4))$  yields  $(4, 9, 16)$



# Apply-to-all

---

- A functional form that takes a single function as a parameter and yields a list of values obtained by applying the given function to each element of a list of parameters

Form:  $\alpha$

For  $h(x) \equiv x * x$

$\alpha(h, (2, 3, 4))$  yields  $(4, 9, 16)$

Python map:

`map(h, [2,3,4]) => [4,9,16]`

# Recursion

---

A factorial function

F(n):

```
if n <= 1 return 1;           // 0! = 1
else return n * F(n-1);       // n! = n * (n-1)!
```

$F(4) \Rightarrow 4 * F(3)$      $F(3) \Rightarrow 3 * F(2)$      $F(2) \Rightarrow 2 * F(1)$

**$F(1) = 1$**  (end of recursion)

Now, backward computation

$F(2) = 2 * 1 = 2 \Rightarrow F(3) = 3 * 2 = 6 \Rightarrow F(4) = 4 * 6 = 24$

# Tail Recursion

---

- What is tail recursion?
  - A function is *tail recursive* if its recursive call is the last operation in the function
- A tail recursive function is more efficient
  - It can be automatically converted by a compiler to a non-recursive version, i.e. using iteration
- The **factorial** function defined previously is **NOT** in tail recursion.
  - The last operation is multiplication, not recursive call.

# Convert to tail recursion w/ a helper()

---

## Tail recursion

`factorial (n) = helper (n, 1)`

`helper (n, s):`

`if n <= 1 return s`

`else return helper (n-1, n * s)`

`//the last operation is a recursive call!`

# Convert to tail recursion w/ a helper()

---

## Tail recursion

`factorial (n) = helper (n, 1)`

`helper (n, s):`

`if n <= 1 return s`

`else return helper (n-1, n * s)`

`//the last operation is a recursive call!`

$F(4) \Rightarrow h(4, 1)$

$h(4, 1)$

$\Rightarrow h(3, 4*1)$

$\Rightarrow h(2, 3*4)$

$\Rightarrow h(1, 2*12)$

$\Rightarrow 24$

# Are the following tail recursions?

---

$$F(n) = F(n-1) + F(n-2)$$

$$F(1) = 1$$

$$F(2) = 1$$

$$G(n) = G(n-2) \quad n > 10$$

$$G(n) = G(n-1) \quad n \text{ in } [1, 10]$$

$$G(n) = 3 \quad n \leq 0$$

# Are the following tail recursions?

---

$F(n) = F(n-1) + F(n-2)$  //not tail recursion

$F(1) = 1$

$F(2) = 1$

$G(n) = G(n-2) \quad n > 10$  //yes

$G(n) = G(n-1) \quad n \text{ in } [1, 10]$

$G(n) = 3 \quad n \leq 0$

# Fundamentals of Functional Programming Languages

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- The objective of the design of a FPL is **to mimic mathematical functions to the greatest extent possible**
- The basic process of computation is fundamentally different in a FPL than in an imperative language
  - In an imperative language, operations are done and the results are stored in variables for later use
  - Management of variables is a constant concern and source of complexity for imperative programming
- In an FPL, variables are not necessary, as is the case in mathematics
- *Referential Transparency* – In an FPL, the evaluation of a function always produces the same result given the same parameters



# Reference Transparency – Side effect free

---

```
a = 3  
y = f(a)  
print(y)
```

```
b=3  
z = f(b)  
print(z)
```

```
//y equal z?
```

---

```
a = 3  
y = f(a)  
print(y)
```

```
b=3  
z = f(b)  
print(z)
```

```
//y=?
```

```
//z=?
```

```
extern int sum = 0;  
    //a global variable
```

```
int f (int x) {  
    sum += 1;  
    return x + sum;  
}
```

---

```
a = 3  
y = f(a)  
print(y)
```

```
b=3  
z = f(b)  
print(z)
```

```
//y=4
```

```
//z=5
```

```
extern int sum = 0;  
    //a global variable
```

```
int f (int x) {  
    sum += 1;  
    return x + sum;  
}
```

# Characteristics of FP languages

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- Functions
  - Built-in, user-defined, lambda expressions
- Recursions
- Higher-Order Functions
- Reference transparency
  - No Side-effects
- Lazy Evaluation
- Modularity

# Introduction to Lisp

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- Lisp (historically LISP)
  - LISt Processing
- Designed by John McCarthy, MIT
  - 1958; 62 years ago (one year younger than FORTRAN)
- Many dialects
  - Common Lisp: a lot of imperative features introduced
  - Scheme: 1970s
    - designed to be a cleaner, more modern, and simpler version
- Pure Lisp
  - Commonly refer to the pure functional programming features in Lisp

# Lisp: Program and Data

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- Lisp unifies the program and data
  - Data: atom (primitive values) and list
    - List: (3 (2 4) (5 2 45))
  - A Lisp program is represented by a list
    - i.e. a program could serve as a data object
      - Able to write a Lisp interpreter using Lisp

e.g. A sample Lisp program

```
(defun sqr (x ) (* x x))
```

```
(sqr 4) ;;that will return 16
```

```
(setq prog (defun sqr(x) (* x x)))
```

```
(car prog) ;;that will return the first item of prog, i.e. defun
```

# Lisp: Expressions and Program Style

---

- **Prefix** notation

```
(+ (* 3 5) 7)
```

```
(> 3 (- a 2))
```

- Conditional form

```
(cond ((> a b) (+ a b))
```

```
(T (- a b))) ;;if (a > b) a + b else a - b
```

- Lots of parenthesis

```
(defun myFun (x y)
```

```
(cond ((> x y) (+ x y))
```

```
(T (- x y))))
```

# LAMBDA Expressions

---

- Form is based on  $\lambda$  notation

e.g., `(LAMBDA (x) (* x x))`

`x` is called a bound variable

- Lambda expressions can be applied to parameters

e.g., `((LAMBDA (x) (* x x)) 7) => 49`

- LAMBDA expressions can have any number of parameters

`(LAMBDA (a b x) (+ (* a x x) (* b x)))`



# Output Functions

---

- Usually not needed, because the interpreter always displays the result of a function evaluated at the top level (not nested)
- Scheme has `PRINTF`, which is similar to the `printf` function of C
- Note: **explicit input and output are not part of the pure functional programming model**, because input operations change the state of the program and output operations are side effects

# Control Flow

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- A number of forms, COND, IF, UNLESS, ...
  - Most popular COND

```
(COND ((> a b) 'large)
      ((= a b) 'same)
      (T      'small))
```

$(\text{if } a \ b \ c) == (\text{cond } (a \ b) \ (T \ c))$

- Loops

Do loops are most popular, however loops are discouraged in functional programming

**Use recursion**

# Function Definition

---

```
(defun member (atm a_list)
  ;;check if an atm is in a_list or not
  (COND
    ((NULL a_list) `nil)
    ((EQ atm (CAR a_list)) `T)
    (T (member atm (CDR a_list))))
  ) )
```

# Using Lisp Interpreter

---

```
>(defun square (x) (* x x))
```

```
SQUARE
```

```
>(square 2)
```

```
4
```

```
>(square 1.4142158)
```

```
2.0000063289696399
```

# Higher order functions

## Passing functions as arguments

---

- Apply
  - Can be given a number of arguments, but the last one must be a list

```
>(apply #' + '(1 2 3))
```

```
6
```

## Funcall

- Does the same thing as *apply* but doesn't need the arguments to be packed in a list

```
>(defun add2 (x) (+ x 2))
```

```
>(funcall #'add2 5)
```

```
>7
```

# Lambda expression as function argument

---

- Examples

```
>(funcall #'(lambda (N) (+ 1 N)) 3)
```

```
4
```

```
>(apply #'(lambda (A B C) (* A (+ B C))) '(4 3 5))
```

```
32
```

;;make sure you use #' in front of the function  
parameter name

# Mapping Functions

---

- Mapping function
  - Applied successively to elements of one or more lists
- Mapcar

```
>(mapcar #'numberp '(A 3 B 2 4))  
(nil T nil T T)
```

```
>(mapcar #'(lambda (n) (+ 1 n)) '(5 3 6 7 2))  
(6 4 7 8 3)
```

# Mapcar: More Examples

---

```
(defun double (x) (* 2 x))  
(mapcar #'double '(1 2 3))  
=> (2 4 6)
```

More mapping  
functions: maplist,  
mapc, ...

```
(mapcar #'sqrt '(1 2 3 4))  
=> (1 1.4132135 1.7320508 2)
```

```
(mapcar #'oddp '(1 2 3)) => (T nil T)
```

```
(mapcar #'(lambda (x) (1 + (* 2 x))) '(1 2 3))  
=> (3 5 7)
```



# Recursive Schemata

---

- **Families of recursive functions** which may help in solving Lisp problems.
- Each schema (plural schemata) represents a whole family of recursive functions which are similar in code.

# OP-All (operate-all)

---

```
(defun OP-All (L)
  (cond ((null L) nil)
        (T (cons (f (car L)) (OP-All (cdr L))))))
```

- Examples

(SQ-ALL '(3 1 4 1)) -> (9 1 16 1)

(INC-ALL '(3 1 4 1)) -> (4 2 5 2)

(LISTIFY-ALL '(A 2 B)) -> ((A) (2) (B))

(Double-ALL '(3 1 4 1)) -> (6 2 8 2)

# OP-Some (operate-some)

---

```
(defun OP-SOME (L)
  (cond ((null L) nil)
        ((test (car L))
         (cons (f (car L)) (OP-SOME (cdr L))))
        (T (cons (car L) (OP-SOME (cdr L))))))
```

- Examples

(SQ-ODD '(3 5 4 7)) -> (9 25 4 49)

(INC-ODD '(3 5 4 7)) -> (4 6 4 8)

More: DOUBLE-EVEN, INC#, ...

# KEEP–SOME/DELETE–SOME

---

- KEEP–SOME/DELETE–SOME takes a list and returns another list, keeping/deleting some of the elements

(KEEP–ODD '(3 1 4 1)) → (3 1 1)

(TOSS–ODD '(3 1 4 1)) → (4)

More: KEEP–EVEN, KEEP#, KEEP–PS (perfect square),  
DEL–ODD, ...

# Other Functional Languages

---

- ML
- Haskell
- F#
- ...

# F#

---

- Based on Ocaml, which is a descendant of ML and Haskell
- Fundamentally a functional language, but with imperative features and supports OOP
- Has a full-featured IDE, an extensive library of utilities, and interoperates with other .NET languages
- Includes tuples, lists, discriminated unions, records, and both mutable and immutable arrays
- Supports generic sequences, whose values can be created with generators and through iteration

# F# (continued)

---

- Sequences

```
let x = seq {1..4};;
```

- Generation of sequence values is lazy

```
let y = seq {0..100000000};;
```

Sets `y` to `[0; 1; 2; 3; ...]`

- Default stepsize is 1, but it can be any number

```
let seq1 = seq {1..2..7}
```

Sets `seq1` to `[1; 3; 5; 7]`

- Iterators – not lazy for lists and arrays

```
let cubes = seq {for i in 1..4 -> (i, i * i * i)};;
```

Sets `cubes` to `[(1, 1); (2, 8); (3, 27); (4, 64)]`

# F# (continued)

---

- Functions

- If named, defined with **let**; if lambda expressions, defined with **fun**

```
(fun a b -> a / b)
```

```
let doubleIt (x : int) = 2 * x
```

- No difference between a name defined with **let** and a function without parameters
- The extent of a function is defined by indentation
- If a function is recursive, its definition must include the **rec** reserved word



# F# (continued)

---

- Why F# is Interesting:
  - It builds on previous functional languages
  - It supports virtually all programming methodologies in widespread use today
  - It is the first functional language that is designed for interoperability with other widely used languages
  - At its release, it had an elaborate and well-developed IDE and library of utility software

# Multi-Paradigm Languages

---

- Support for functional programming is increasingly creeping into imperative languages
  - C#, Python, Ruby, ...
  - Features: e.g. map, anonymous functions, ...
  - e.g. Anonymous functions (lambda expressions)
    - **JavaScript**: leave the name out of a function definition
    - **C#**: `i => (i % 2) == 0` (returns true or false depending on whether the parameter is even or odd)
    - **Python**: `lambda a, b : 2 * a - b`

# Functional vs. Imperative Languages

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- Imperative Languages:
  - Efficient execution
  - Complex semantics
  - Complex syntax
  - Concurrency is programmer designed
- Functional Languages:
  - Simple semantics
  - Simple syntax
  - Less efficient execution
  - Programs can automatically be made concurrent

---

# Lecture 11 – Part II

## Logic Programming and Prolog

### A Brief Introduction

# Introduction: Logic Programming Languages

---

- Characteristics of Logic programming languages
  - Programs are expressed in a form of symbolic logic
  - Use a **logical inferencing process** to produce results
  - *Declarative* rather than *procedural*:
    - Only specification of *results* are stated (not detailed *procedures* for producing them)
    - A **built-in Engine** for the language will conduct inferences and produce results
    - Programmer's focus: logical presentation of the problem, not detailed solution (i.e. algorithms are not needed.)

# Example: Sorting a List

---

- Describe the *characteristics* of a sorted list, not the *process* of rearranging a list

sort(old\_list, new\_list):

permute (old\_list, new\_list)  $\cap$  sorted (new\_list)

sorted (list):

$\forall_j$  such that  $1 \leq j < n$ , list(j)  $\leq$  list (j+1)

Programmer: write problem specification.  
System: solve the problem for you.

# Main Components of Logic Programs

---

- Proposition
  - Facts
    - Objects, terms, compound terms, ...
  - Query
    - Resolution
- **Symbolic logic:** Behind the engine!
  - Express propositions
  - Express relationships between propositions
  - Describe how new propositions can be inferred from other propositions

# Example

---

`factorial(0,1).`    `/*a fact: 0! is 1.*/`

`factorial(N,F) :- N > 0, N1 is N-1,`  
                  `factorial(N1,F1), F is N * F1.`  
`/*a rule to calculate F = N!*/`

Now, how the "Engine behind" calculates  
`factorial(N,F)`, say `factorial(4,F)`, i.e.  $F = 4!$ ?



# Resolution

---

- **Resolution**: a key feature that needs to be supported by logic language interpreter. It includes
  - *Unification*: finding values for variables in propositions that allows matching process to succeed
  - *Instantiation*: assigning temporary values to variables to allow unification to succeed
  - After instantiating a variable with a value, if matching fails, may need to *backtrack* and instantiate with a different value

e.g.  $Q(X) :- x + 1$  /\* what is  $Q(3)$ ? Here,  $x$  will be unified with 3 \*/  
 $like(X, Y) :- friends(X, Z), like(Z, Y)$   
 $like(mary, fb)$ ? /\*does  $Z$  exist? Or can you instantiate  $Z$  to some value?

# Backtracking

---

8-Queen Problem (illustrated by 4-Queen)

	Q		
			Q
Q			
		Q	

		Q	
Q			
			Q
	Q		

# Logic Programming: Summary

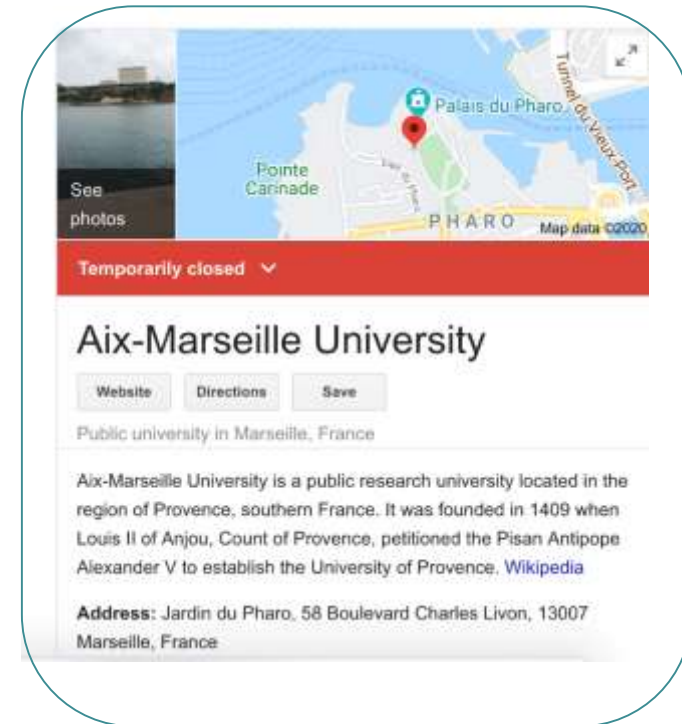
---

- **Declarative semantics**
  - There is a simple way to determine the meaning of each statement
  - Simpler than the semantics of imperative languages
- **Programming is nonprocedural**
  - Programs do not state how a result is to be computed, but rather the form of the result

# The Origins of Prolog

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- University of Aix–Marseille (Calmerauer & Roussel)
  - Natural language processing
- University of Edinburgh (Kowalski)
  - Automated theorem proving



# Prolog Basic Components

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- Facts: used for the hypotheses

student(shelley).

student (bill).

likes(bill, fb).

likes (shelley, yt).

- Rules

- **Right side:** *antecedent* (**if** part)
  - May be single term or conjunction
- **Left side:** *consequent* (**then** part)
  - Must be single term

A :- B  
if B then A

# Example Rules

---

```
friend(bill,shelley):-  
    likes(bill,fb), likes(shelley,fb).
```

- Can use variables (*universal objects*) to generalize meaning:

```
parent(X,Y):- mother(X,Y).
```

```
parent(X,Y):- father(X,Y).
```

```
grandparent(X,Z):- parent(X,Y), parent(Y,Z).
```

# Goal Statements

---

- For theorem proving, theorem is in form of proposition **that we want system to prove or disprove** – *goal statement*

- Example

`?– friend(bill,shelley).` %are bill and shelley friends?

- Conjunctive propositions and propositions with variables also legal goals

`?– factorial(3,W).` %W is 3!, what is W?

`W=6` %answer by prolog engine

# Facts (database) and Rules

---

```
father(jack, susan).      /* Fact 1 jack is father of susan*/
father(jack, ray).        /* Fact 2 */
father(david, mary).      /* Fact 3 */
father(david, john).      /* Fact 4 */
mother(karen, susan).     /* Fact 5 */
mother(karen, ray).       /* Fact 6 */
mother(susan, mary).      /* Fact 7 */
mother(susan, john).      /* Fact 8 */
```

```
parent(X, Y) :- father(X, Y). /* Rule 1 */
parent(X, Y) :- mother(X, Y). /* Rule 2 */
grandparent(X, Y) :- parent(X, Z), parent(Z, Y). /* Rule 3 */
```

```
?- parent(susan, mary).    /*is susan a parent of mary? */
```

yes

```
?- parent(ray, john).
```

no

```
?- parent (X, susan).
```

jack

karen

no



# Inferencing Process of Prolog

---

- Queries are called goals
- If a goal is a compound proposition, each of the facts is a subgoal
- To prove a goal is true, must find a chain of inference rules and/or facts. For goal Q:

$P_2 \text{ :- } P_1$

$P_3 \text{ :- } P_2$

...

$Q \text{ :- } P_n$

- Process of proving a subgoal called matching, satisfying, or resolution

# Approaches

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- *Matching* is the process of proving a proposition
- Proving a subgoal is called *satisfying* the subgoal
- *Bottom-up resolution, forward chaining*
  - Begin with facts and rules of database and attempt to find sequence that leads to goal
  - Works well with a large set of possibly correct answers
- *Top-down resolution, backward chaining*
  - Begin with goal and attempt to find sequence that leads to set of facts in database
  - Works well with a small set of possibly correct answers
- **Prolog** implementations use **backward chaining**

# Subgoal Strategies

---

- **Breadth-first search**: work on all subgoals in parallel
- **Depth-first search**: find a complete proof for the first subgoal before working on others
  - **Prolog uses depth-first search**
    - Can be done with fewer computer resources
- **Backtracking**
  - With a goal with multiple subgoals, if fail to show truth of one of subgoals, reconsider previous subgoal to find an alternative solution.
  - Begin search where previous search left off
  - Can **take lots of time and space** because may find all possible proofs to every subgoal

# Example

---

```
speed(ford,100) .
speed(chevy,105) .
speed(dodge,95) .
speed(volvo,80) .
time(ford,20) .
time(chevy,21) .
time(dodge,24) .
time(volvo,24) .
distance(X,Y) :-    speed(X,Speed) ,
                    time(X,Time) ,
                    Y is Speed * Time.
```

Simple unification and instantiation,  
no backtracking.

A query: `?- distance(chevy, Chevy_Distance) .`

# Example: With backtracking

---

```
father(jack, susan).           /* Fact 1 jack is father of susan */
father(jack, ray).             /* Fact 2 */
father(david, mary).           /* Fact 3 */
father(david, john).           /* Fact 4 */
mother(karen, susan).          /* Fact 5 */
mother(karen, ray).            /* Fact 6 */
mother(susan, mary).           /* Fact 7 */
mother(susan, john).           /* Fact 8 */

parent(X, Y) :- father(X, Y).   /* Rule 1 */
parent(X, Y) :- mother(X, Y).   /* Rule 2 */
grandparent(X, Y) :- parent(X, Z), parent(Z, Y). /* Rule 3 */
```

?- grandparent (X, mary).

mary -> david -> no (now, backtracking)  
mary -> susan -> jack (backtracking again)  
mary -> susan -> karen

# Deficiencies of Prolog

---

- Resolution order control
  - In a pure logic programming environment, the order of attempted matches is nondeterministic and all matches would be attempted concurrently
- The closed-world assumption
  - The only knowledge is what is in the database
- The negation problem
  - Anything not stated in the database is assumed to be false
- Intrinsic limitations
  - It is easy to state a sort process in logic, but difficult to actually do—it doesn't know how to sort

# Applications of Logic Programming

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- Relational database management systems
- Expert systems
- Natural language processing
- New paradigm: declarative programming