

# Lecture 3

## Functional Programming

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## Announcements

1. Assignment due on Friday
2. Reading SICP 1.2 (pages 31-50)
3. Etutor assignment due Friday 8<sup>th</sup>
4. Labs (PSes) start this week

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# Lecture 2

## Functional Programming & Scheme

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### Main programming paradigms

Paradigm	Description	Main traits	Related paradigm(s)	Examples
<b>Imperative</b>	Programs as <i>statements</i> that <i>directly</i> change computed <i>state</i> ( <i>datafields</i> )	Direct <i>assignments</i> , common <i>data structures</i> , <i>global variables</i>		C, C++, Java, Kotlin, PHP, Python, Ruby
<b>Procedural</b>	Derived from structured programming, based on the concept of <i>modular programming</i> or the <i>procedure call</i>	<i>Local variables</i> , sequence, selection, <i>iteration</i> , and <i>modularization</i>	Structured, imperative	C, C++, Lisp, PHP, Python
<b>Functional</b>	Treats <i>computation</i> as the evaluation of <i>mathematical functions</i> avoiding <i>state</i> and <i>mutable data</i>	<i>Lambda calculus</i> , <i>compositionality</i> , <i>formula recursion</i> , <i>referential transparency</i> , no <i>side effects</i>	Declarative	C++, <sup>[1]</sup> C#, <sup>[2]</sup> <i>clojure</i> , <i>CoffeeScript</i> , <sup>[3]</sup> <i>Elixir</i> , <i>Erlang</i> , <i>F#</i> , <i>Haskell</i> , <i>Java</i> (since version 8), <i>Kotlin</i> , <i>Lisp</i> , <i>Python</i> , <i>R</i> , <sup>[4]</sup> <i>Ruby</i> , <i>Scala</i> , <i>SequenceL</i> , <i>Standard ML</i> , <i>JavaScript</i> , <i>Elm</i>
<b>Object-oriented</b>	Treats <i>datafields</i> as <i>objects</i> manipulated through predefined <i>methods</i> only	<i>Objects</i> , <i>methods</i> , <i>message passing</i> , <i>information hiding</i> , <i>data abstraction</i> , <i>encapsulation</i> , <i>polymorphism</i> , <i>inheritance</i> , <i>serialization-marshalling</i>	Procedural	<i>Common Lisp</i> , C++, C#, <i>Eiffel</i> , <i>Java</i> , <i>Kotlin</i> , <i>PHP</i> , <i>Python</i> , <i>Ruby</i> , <i>Scala</i> , <i>JavaScript</i> , <i>Smalltalk</i>
<b>Declarative</b>	Defines program logic, but not detailed <i>control flow</i>	<i>Fourth-generation languages</i> , <i>spreadsheets</i> , <i>report program generators</i>		<i>SQL</i> , <i>regular expressions</i> , <i>Prolog</i> , <i>OWL</i> , <i>SPARQL</i> , <i>Datalog</i> , <i>XSLT</i>

Source: Wikipedia

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## Write a function for factorial



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## Kinds of Language Constructs

- Primitives
- Means of combination
- Means of abstraction

```
def create_adder(x):  
    global tic  
    tic = x  
  
    def adder():  
        global tic  
        tic = tic + 1  
        return tic  
  
    return adder  
  
fun_a = create_adder(0)  
fun_b = create_adder(0)  
print(fun_a(), fun_b(), fun_a(), fun_b())
```

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## Language elements – primitives

- Names for built-in procedures
  - $+$ ,  $*$ ,  $-$ ,  $/$ ,  $=$ , ...
  - What is the value of such an expression?
  - $+$   $\rightarrow$  [#procedure ...]
  - Evaluate by looking up value associated with name in a special table

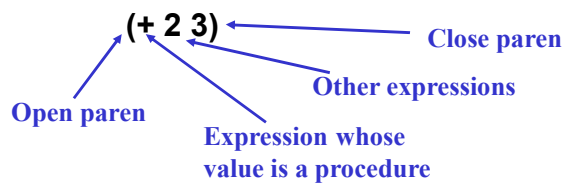
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## Language elements – combinations

- How do we create expressions using these procedures?



- Evaluate by getting values of sub-expressions, then applying operator to values of arguments

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## Language elements -- abstractions

- In order to abstract an expression, need way to give it a name

### **(define score 23)**

- This is a special form
  - Does not evaluate second expression
  - Rather, it pairs name with value of the third expression
- Return value is unspecified

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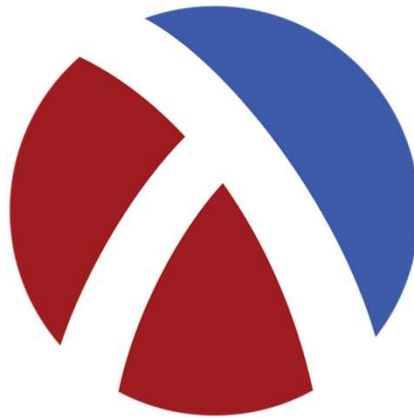
Nugget



Functions are first class citizens

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# Hold your breath



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## Language elements -- abstractions

- Need to capture ways of doing things – use procedures

$(\text{lambda } (x) (* x x))$   
 ↑                      ↑                      ↑  
 To process   something   multiply it by itself

(The word **parameters** is written in red above the  $(x)$  and the word **body** is written in red above the  $(* x x)$ .)

- Special form – creates a procedure and returns it as value

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## Scheme Basics

- Rules for evaluation
  1. If **self-evaluating**, return value.
  2. If a **name**, return value associated with name in environment.
  3. If a **special form**, do something special.
  4. If a **combination**, then
    - a. *Evaluate* all of the subexpressions of combination (in any order)
    - b. *apply* the operator to the values of the operands (arguments) and return result
- Rules for application
  1. If procedure is **primitive procedure**, just do it.
  2. If procedure is a **compound procedure**, then:
    - evaluate** the body of the procedure with each formal parameter replaced by the corresponding actual argument value.

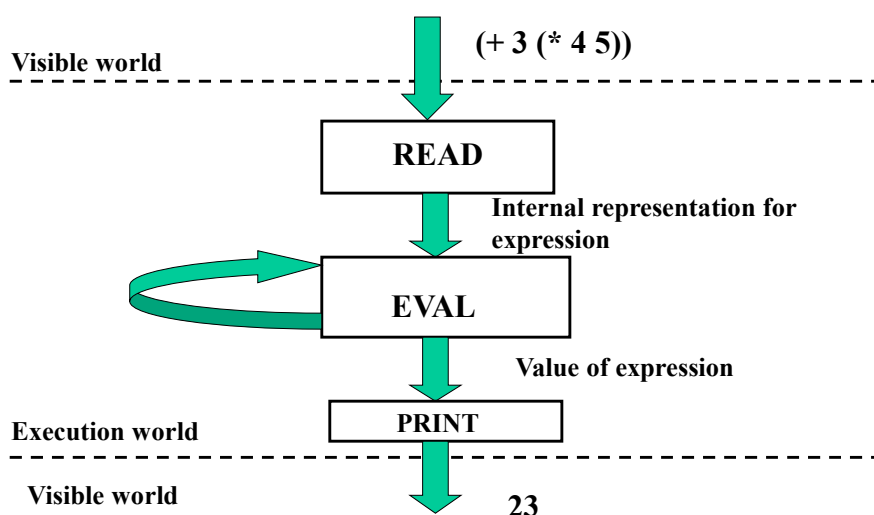
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## Read-Eval-Print



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# Functional Programming

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### Lecture Nuggets

- Lambda expressions creates procedures
  - Formal parameters
  - Body
  - Procedures allow creating abstractions
- We can solve problems by creating functions
- The substitution model is a good mental model of an interpreter

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## Nugget



Lambda expressions creates  
procedures

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## Language elements -- abstractions

- Use this anywhere you would use a procedure

```
((lambda (x) (* x x)) 5)
```

```
(* 5 5)
```

```
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```

- Can give it a name

```
(define square (lambda (x) (* x x)))
```

```
(square 5) → 25
```

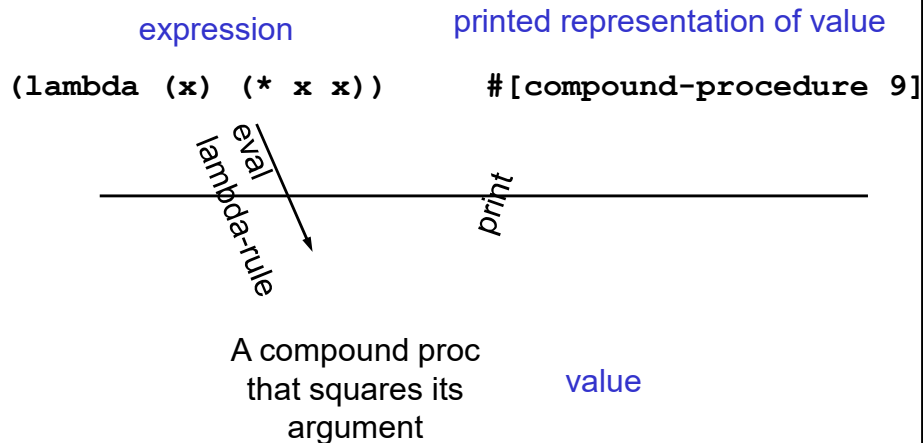
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## Lambda: making new procedures



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## Interaction of define and lambda

```
1. (lambda (x) (* x x))
    ==> #[compound-procedure 9]
2. (define square (lambda (x) (* x x)))
    ==> undef
3. (square 4)
    ==> 16
4. ((lambda (x) (* x x)) 4)
    ==> 16
5. (define (square x) (* x x)) ==> undef
```

This is a convenient shorthand (called “syntactic sugar”) for 2 above – this is a use of lambda!

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## Lambda special form

- lambda syntax `(lambda (x y) (/ (+ x y) 2))`
- 1st operand position: the **parameter list** `(x y)`
  - a list of names (perhaps empty)
  - determines the number of operands required
- 2nd operand position: the **body** `(/ (+ x y) 2)`
  - may be any expression
  - not evaluated when the lambda is evaluated
  - evaluated when the procedure is applied
- semantics of lambda:

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## THE VALUE OF A LAMBDA EXPRESSION IS A PROCEDURE

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## Nugget



We can solve problems by creating functions

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## Procedures allow abstraction

- Breaking computation into modules that capture commonality
  - Enables reuse in other places (e.g. square)
- Isolates details of computation within a procedure from use of the procedure
- May be many ways to divide up

```
(define square (lambda (x) (* x x)))  
(define sum-squares  
  (lambda (x y) (+ (square x) (square y))))  
(define pythagoras  
  (lambda (y x) (sqrt (sum-squares y x))))
```

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## Abstracting the process

- Stages in capturing common patterns of computation
  - Identify modules or stages of process
  - Capture each module within a procedural abstraction
  - Construct a procedure to control the interactions between the modules
  - Repeat the process within each module as necessary

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## A more complex example

- Remember our method for finding sqrts
  - To find the square root of  $X$ 
    - Make a guess, called  $G$
    - If  $G$  is close enough, stop
    - Else make a new guess by averaging  $G$  and  $X/G$

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## Imperative Knowledge

- “How to” knowledge

To find an approximation of square root of  $x$ :

- Make a guess  $G$
- Improve the guess by averaging  $G$  and  $x/G$
- Keep improving the guess until it is good enough

Example:  $\sqrt{x}$  for  $x = 2$ .

$X = 2$	$G = 1$
$X/G = 2$	$G = \frac{1}{2}(1 + 2) = 1.5$
$X/G = 4/3$	$G = \frac{1}{2}(3/2 + 4/3) = 17/12 = 1.416666$
$X/G = 24/17$	$G = \frac{1}{2}(17/12 + 24/17) = 577/408 = 1.4142156$

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## The stages of “SQRT”

- When is something “close enough”
- How do we create a new guess
- How do we control the process of using the new guess in place of the old one

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## Procedural abstractions

For “close enough”:

```
(define close-enuf?
  (lambda (guess x)
    (< (abs (- (square guess) x)) 0.001)))
```



Note use of procedural abstraction!

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## Procedural abstractions

For “improve”:

```
(define average
  (lambda (a b) (/ (+ a b) 2)))
(define improve
  (lambda (guess x)
    (average guess (/ x guess))))
```

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## Why this modularity?

- “Average” is something we are likely to want in other computations, so only need to create once
- Abstraction lets us separate implementation details from use
  - E.g. could redefine as

```
(define average
  (lambda (x y) (* (+ x y) 0.5)))
```

- No other changes needed to procedures that use **average**
- Also note that variables (or parameters) are internal to procedure – cannot be referred to by name outside of scope of lambda

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## Controlling the process

- Basic idea:
  - Given X, G, want (**improve G X**) as new guess
  - Need to make a decision – for this need a new *special form*

```
(if <predicate> <consequence> <alternative>)
```

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## The IF special form

`(if <predicate> <consequence> <alternative>)`

- Evaluator first evaluates the `<predicate>` expression.
- If it evaluates to a TRUE value, then the evaluator evaluates and returns the value of the `<consequence>` expression.
- Otherwise, it evaluates and returns the value of the `<alternative>` expression.
- Why must this be a special form?

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## Controlling the process

- Basic idea:
  - Given X, G, want `(improve G X)` as new guess
  - Need to make a decision – for this need a new *special form*
  - `(if <predicate> <consequence> <alternative>)`
  - So heart of process should be:

```
(if (close-enuf? G X)
    G
    (improve G X))
```

- But somehow we want to use the value returned by “improving” things as the new guess, and repeat the process

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## Controlling the process

- Basic idea:
  - Given X, G, want `(improve G X)` as new guess
  - Need to make a decision – for this need a new *special form*  
`(if <predicate> <consequence> <alternative>)`
  - So heart of process should be:  

```
(define sqrt-loop (lambda (G X)
  (if (close-enuf? G X)
      G
      (sqrt-loop (improve G X) X)
  )
)
```
  - But somehow we want to use the value returned by “improving” things as the new guess, and repeat the process
  - Call process `sqrt-loop` and reuse it!

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## Putting it together

- Then we can create our procedure, by simply starting with some initial guess:

```
(define sqrt
  (lambda (x)
    (sqrt-loop 1.0 x)))
```

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## Checking that it does the “right thing”

- Next lecture, we will see a formal way of tracing evolution of evaluation process
- For now, just walk through basic steps
  - `(sqrt 2)`
    - `(sqrt-loop 1.0 2)`
    - `(if (close-enuf? 1.0 2) ... ...)`
    - `(sqrt-loop (improve 1.0 2) 2)`
  - This is just like a normal combination*
  - `(sqrt-loop 1.5 2)`
  - `(if (close-enuf? 1.5 2) ... ...)`
  - `(sqrt-loop 1.4166666 2)`
- And so on...

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### Nugget



The substitution model is a good mental model of an interpreter

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## Remainder of this lecture

- Substitution model
- An example using the substitution model
- Designing recursive procedures
- Designing iterative procedures



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## Substitution model

- a way to figure out what happens during evaluation
  - not really what happens in the computer
- to apply a compound procedure:
  - evaluate the body of the procedure, with each parameter replaced by the corresponding operand
- to apply a primitive procedure: just do it

```
(define square (lambda (x) (* x x)))
```

```
1.      (square 4)
2.      (* 4 4)
3.      16
```



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## Substitution model details

```
(define square (lambda (x) (* x x)))
(define average (lambda (x y) (/ (+ x y) 2)))
```

```
(average 5 (square 3))
(average 5 (* 3 3))
(average 5 9)
```

first evaluate operands,  
then substitute (applicative order)

```
(/ (+ 5 9) 2)
(/ 14 2)
7
```

if operator is a primitive procedure,  
replace by result of operation



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## End of part 1

- how to use substitution model to trace evaluation



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## A less trivial procedure: factorial

- Compute  $n$  factorial, defined as  $n! = n(n-1)(n-2)(n-3)\dots 1$

- Notice that  $n! = n * [(n-1)(n-2)\dots] = n * (n-1)! \quad \text{if } n > 1$

```
(define fact
  (lambda (n)
    (if (= n 1)
        1
        (* n (fact (- n 1))))))
```

- predicate = tests numerical equality

`(= 4 4) ==> #t` (true)

`(= 4 5) ==> #f` (false)

- if special form

`(if (= 4 4) 2 3) ==> 2`

`(if (= 4 5) 2 3) ==> 3`



predicate

consequent

alternative

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```
(define fact(lambda (n)
  (if (= n 1) 1 (* n (fact (- n 1))))))
```

**(fact 3)**

`(if (= 3 1) 1 (* 3 (fact (- 3 1))))`

`(if #f 1 (* 3 (fact (- 3 1))))`

`(* 3 (fact (- 3 1)))`

**(\* 3 (fact 2))**

`(* 3 (if (= 2 1) 1 (* 2 (fact (- 2 1)))))`

`(* 3 (if #f 1 (* 2 (fact (- 2 1)))))`

`(* 3 (* 2 (fact (- 2 1))))`

**(\* 3 (\* 2 (fact 1)))**

`(* 3 (* 2 (if (= 1 1) 1 (* 1 (fact (- 1 1)))))`

`(* 3 (* 2 (if #t 1 (* 1 (fact (- 1 1)))))`

**(\* 3 (\* 2 1))**

`(* 3 2)`

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## The fact procedure is a recursive algorithm

- A recursive algorithm:
  - In the substitution model, the expression keeps growing

```
(fact 3)
(* 3 (fact 2))
(* 3 (* 2 (fact 1)))
```
  - Other ways to identify will be described next time

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## End of part 2

- how to use substitution model to trace evaluation
- how to recognize a recursive procedure in the trace

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## How to design recursive algorithms

- follow the general pattern:
  1. wishful thinking
  2. decompose the problem
  3. identify non-decomposable (smallest) problems

### 1. Wishful thinking

- Assume the desired procedure exists.
- want to implement fact? OK, assume it exists.
- BUT, only solves a smaller version of the problem.

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### 2. Decompose the problem

- Solve a problem by
  1. solve a smaller instance (using wishful thinking)
  2. convert that solution to the desired solution
- Step 2 requires creativity!
  - Must design the strategy before coding.
  - $n! = n(n-1)(n-2)\dots = n[(n-1)(n-2)\dots] = n * (n-1)!$
  - solve the smaller instance, multiply it by  $n$  to get solution

```
(define fact
  (lambda (n) (* n (fact (- n 1)))))
```

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### 3. Identify non-decomposable problems

- Decomposing not enough by itself
- Must identify the "smallest" problems and solve directly
- Define  $1! = 1$

```
(define fact
  (lambda (n)
    (if (= n 1) 1
        (* n (fact (- n 1))))))
```

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### General form of recursive algorithms

- test, base case, recursive case

```
(define fact
  (lambda (n)
    (if (= n 1)          ; test for base case
        1                ; base case
        (* n (fact (- n 1)) ; recursive case
    )))
```

- base case: smallest (non-decomposable) problem
- recursive case: larger (decomposable) problem

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## End of part 3

- Design a recursive algorithm by
  1. wishful thinking
  2. decompose the problem
  3. identify non-decomposable (smallest) problems
- Recursive algorithms have
  1. test
  2. recursive case
  3. base case

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## Iterative algorithms

- In a recursive algorithm, bigger operands => more space
 

```
(define fact (lambda (n)
  (if (= n 1) 1
      (* n (fact (- n 1))))))

(fact 4)
(* 4 (fact 3))
(* 4 (* 3 (fact 2)))
(* 4 (* 3 (* 2 (fact 1))))
(* 4 (* 3 (* 2 1)))
...
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```

- An iterative algorithm uses **constant space**



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### Intuition for iterative factorial

- same as you would do if calculating  $4!$  by hand:
  1. multiply 4 by 3 gives 12
  2. multiply 12 by 2 gives 24
  3. multiply 24 by 1 gives 24
- At each step, only need to remember:  
previous product, next multiplier
- Therefore, constant space
- Because multiplication is associative and commutative:
  1. multiply 1 by 2 gives 2
  2. multiply 2 by 3 gives 6
  3. multiply 6 by 4 gives 24



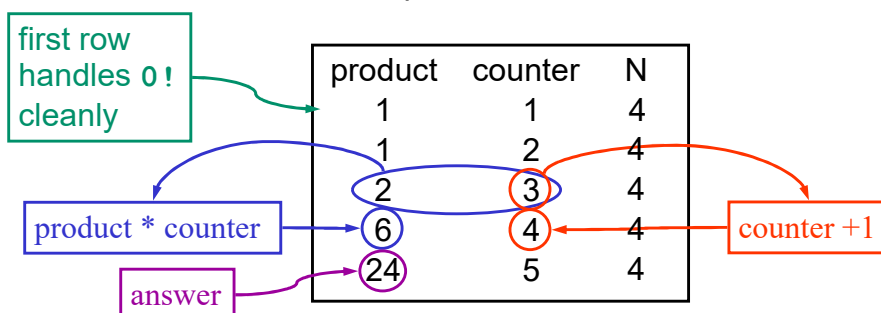
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### Iterative algorithm to compute $4!$ as a table

- In this table:
  - One column for each piece of information used
  - One row for each step



- The last row is the one where  $\text{counter} > n$
- The answer is in the product column of the last row



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## Iterative factorial in scheme

- (define ifact (lambda (n) (ifact-helper 1 1 n)))

(define ifact-helper (lambda (product counter n)

(if (> counter n)

product

(ifact-helper (\* product counter) (+ counter 1) n))))

initial  
row of table

compute next row of table

answer is in product column of last row  
at last row when counter > n



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## Partial trace for (ifact 4)

```
(define ifact-helper (lambda (product count n)
  (if (> count n) product
      (ifact-helper (* product count)
                    (+ count 1) n))))
```

(ifact 4)

(ifact-helper 1 1 4)

(if (> 1 4) 1 (ifact-helper (\* 1 1) (+ 1 1) 4))

(ifact-helper 1 2 4)

(if (> 2 4) 1 (ifact-helper (\* 1 2) (+ 2 1) 4))

(ifact-helper 2 3 4)

(if (> 3 4) 2 (ifact-helper (\* 2 3) (+ 3 1) 4))

(ifact-helper 6 4 4)

(if (> 4 4) 6 (ifact-helper (\* 6 4) (+ 4 1) 4))

(ifact-helper 24 5 4)

(if (> 5 4) 24 (ifact-helper (\* 24 5) (+ 5 1) 4))

24



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## Iterative = no pending operations when procedure calls itself

- Recursive factorial:

```
(define fact (lambda (n)
  (if (= n 1) 1
      (* n (fact (- n 1)) )
  )))
```

pending operation

- (fact 4)  
 (\* 4 (fact 3))  
 (\* 4 (\* 3 (fact 2)))  
 (\* 4 (\* 3 (\* 2 (fact 1))))

- Pending ops make the expression grow continuously

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## Iterative = no pending operations

- Iterative factorial:

```
(define ifact-helper (lambda (product count n)
  (if (> count n) product
      (ifact-helper (* product count)
                    (+ count 1) n))))
```

- (ifact-helper 1 1 4)  
 (ifact-helper 1 2 4)  
 (ifact-helper 2 3 4)  
 (ifact-helper 6 4 4)  
 (ifact-helper 24 5 4)

no pending operations

- Fixed size because no pending operations

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## End of part 4

- Iterative algorithms have constant space
- How to develop an iterative algorithm
  - figure out a way to accumulate partial answers
  - write out a table to analyze precisely:
    - initialization of first row
    - update rules for other rows
    - how to know when to stop
  - translate rules into scheme code
- Iterative algorithms have no pending operations when the procedure calls itself

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## Announcements

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4. Labs (PSes) start this week

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