

## CS61A Lecture 9 MapReduce

2011-07-05  
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### iClicker activity!

Vote for whichever letter you think will have the *least* votes by the time class starts!

Feel free to ask each other what you're voting for (but obviously you don't have to tell the truth!)

### Administrivia

- Project 2 due tonight by 11:59pm!
- Review session this Saturday (7/9)
  - 1:00 to 4:00 pm
  - 306 Soda
- Midterm 1 next Monday (7/11)
  - 7:30 to 10:00 pm
  - 2050 VLSB

### Reminder: accumulate

```
STk> (trace accumulate)
STk> (accumulate + 0 '(1 2 3 4))
(+ 1 (accumulate + 0 '(2 3 4)))
(+ 1 (+ 2 (accumulate + 0 '(3 4))))
(+ 1 (+ 2 (+ 3 (accumulate + 0 '(4))))))
(+ 1 (+ 2 (+ 3 (+ 4 (accumulate + 0 '())))))
(+ 1 (+ 2 (+ 3 (+ 4 0))))
(+ 1 (+ 2 (+ 3 4)))
(+ 1 (+ 2 7))
(+ 1 9)
10
```

### Reminder: accumulate (con't)

```
STk> (trace accumulate)
STk> (accumulate cons '() '(a b c))
(cons 'a (accumulate cons '() '(b c)))
(cons 'a (cons 'b (accumulate cons '() '(c))))
(cons 'a (cons 'b (cons 'c (accumulate cons '() '()))))
(cons 'a (cons 'b (cons 'c '())))
(cons 'a (cons 'b '(c)))
(cons 'a '(b c))
'(a b c)
```

### Reminder: accumulate (con't)

- Potential asymmetry in arguments:

```
(accumulate
 (lambda (next so-far) (+ next so-far))
 0
 '(1 2 3))
```

← always a number   ← always a number

```
(accumulate
 (lambda (next so-far) (cons next so-far))
 '()
 '(1 2 3))
```

← always a number   ← always a list

← Arguments are not the same type!

### Higher Order Function Review!

For these questions, use only higher order functions!

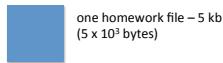
1. Write a procedure `product-of-squares` that takes a list and returns the product of the squares of each element.  
`STk> (product-of-squares '(1 2 3))`  
 36
2. Write a procedure `letter-count` that counts the number of letters in a list of words.  
`STk> (letter-count '(hello there))`  
 10

### Intro to MapReduce

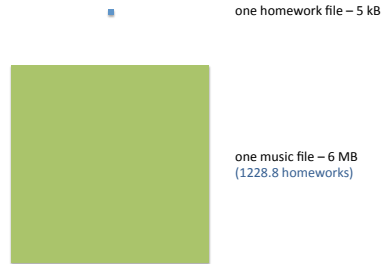


2005 – 200 terabytes of information indexed

### 200 Terabytes?



### 200 Terabytes?

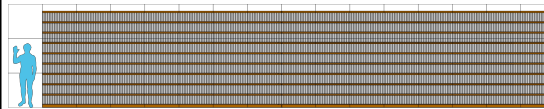


### 200 Terabytes?



### Tangent: how big is Wikipedia?

Wikipedia is only 16 gigabytes!



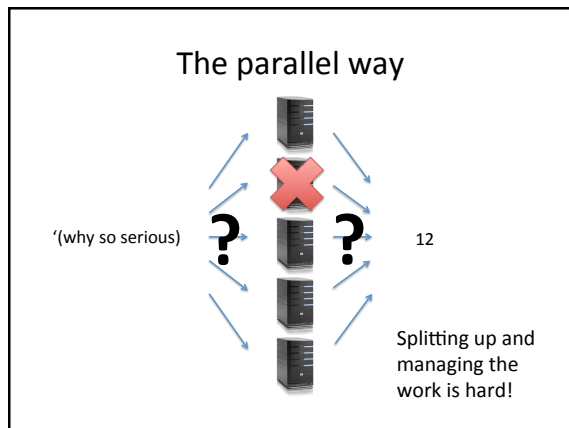
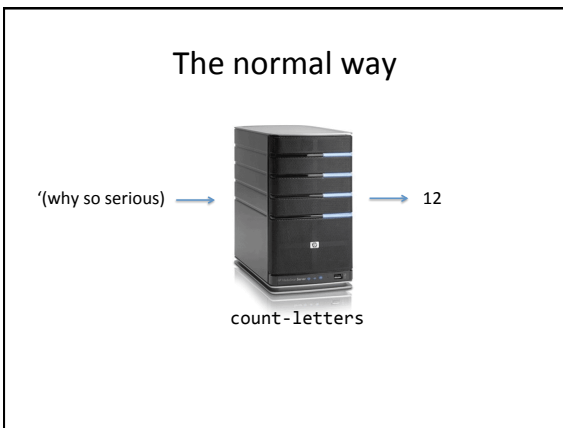
## 200 Terabytes?

- one blu ray disc – 25 GB  
 (5.2 x 10<sup>9</sup> homeworks)  
 (4267 mp3 files)

Google's index size as of 2005 – 200 TB  
 (42 x 10<sup>9</sup> homeworks)  
 (35 x 10<sup>9</sup> mp3 files)  
 (8192 blu ray discs)

“Between the birth of the world and 2003 there were 5 exabytes of information created [...] [now] we create 5 exabytes in two days.”

- Eric Schmidt, Former Google CEO, 2008



### Let's take a look at that again...

```

(define (product-of-squares ls)
  (accumulate * 1
    (map square ls)))
(define (letter-count ls)
  (accumulate + 0
    (map count ls)))
  
```

### The basic idea

```

(accumulate + 0
  (map count '(why so serious)))
  
```

(kinda) **MapReduce**

### The basic idea (map phase)

```
(accumulate + 0
 (map count '(why so serious)))
```

The "mapper"  
 • Procedure of one argument

### The basic idea (reduce phase)

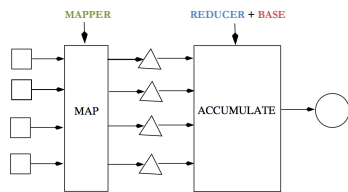
```
(accumulate + 0
 (map count '(why so serious)))
```

The "reducer"  
 • Procedure of two arguments

base-case  
 • The final value passed to the reducer

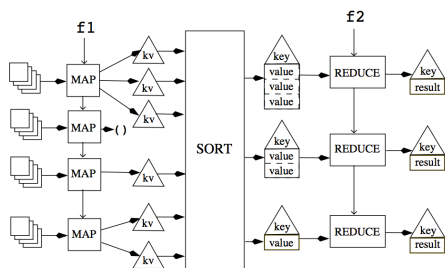
### The basic idea

```
(define (kinda-mapreduce mapper reducer base input)
 (accumulate reducer base
 (map mapper input)))
```



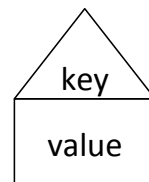
Break time!

### mapreduce

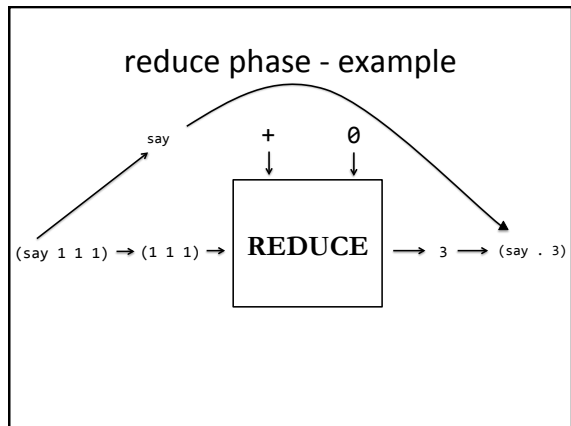
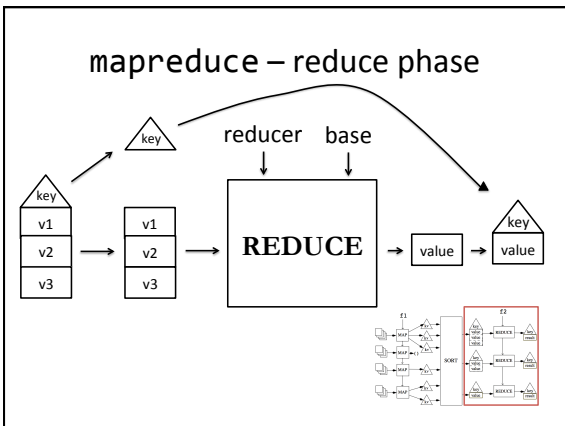
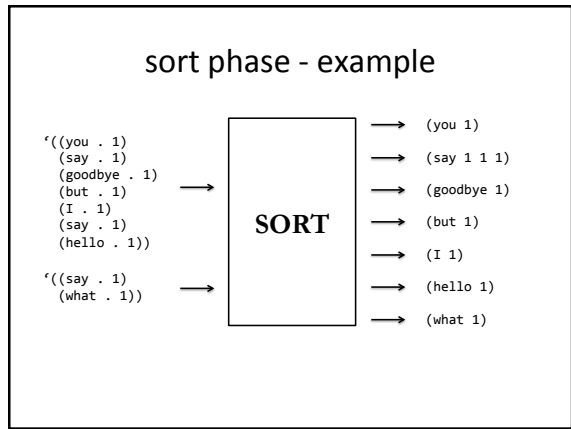
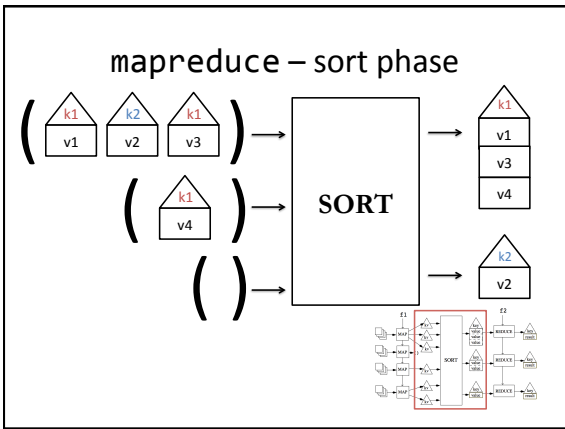
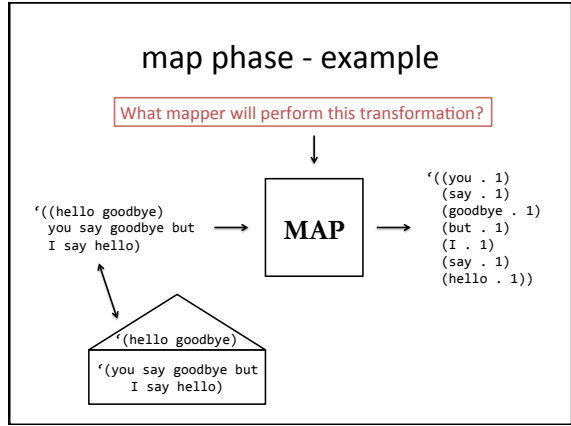
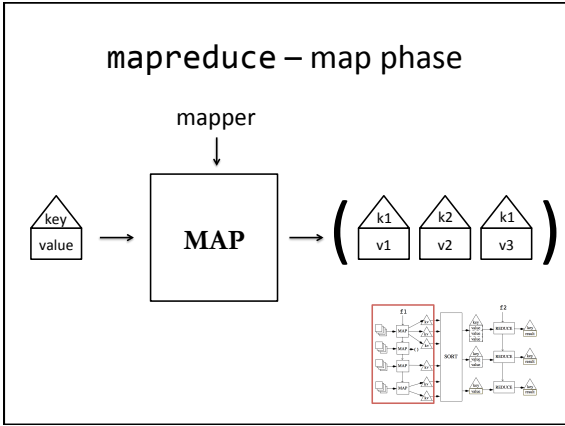


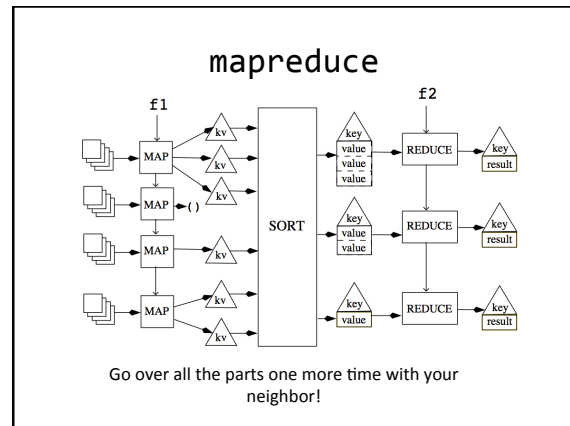
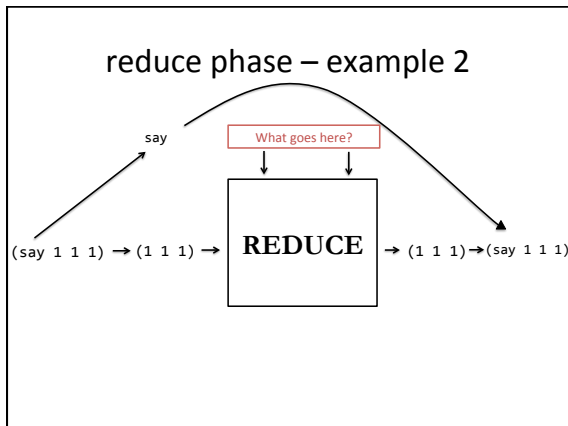
### Key-Value Pairs

```
(define make-kv-pair cons)
(define kv-key car)
(define kv-value cdr)
```



Reminder: respect the abstraction!





### True (A) or false (B)?

1. The reducer is a procedure that takes a list of values and combines them.
2. The mapper can act as a filterer.
3. The kv-pairs that the mapper produces will have the same keys as the final output kv-pairs.

### mapreduce example

Input:

a set of kv-pairs of the form  
((play title) . (line from that play))

Output:

the number of letters in each play, not counting the word "forsooth"

### "Forsooth, a mapper!"

```
(define (forsooth-mapper kvp)
  (map
   (lambda (wd) (make-kv-pair (kv-key kvp) wd))
   (filter
    (lambda (wd) (equal? wd 'forsooth))
    (kv-value kvp))))
```

### "Alack! A reducer!"

```
(define (forsooth-reducer next so-far)
  (+ next so-far))

;; alternatively...
(define forsooth-reducer +)
```

## Putting it all together

- All that's left to do is to make our final call:

```
STk> (mapreduce forsooth-mapper      ;; mapper
        forsooth-reducer            ;; reducer
        0                            ;; base-case
        "/gutenberg/shakespeare") ;; input
```

## Why mapreduce?

mapper          reducer          base-case

---

above the line

below the line

Splitting up work          Process management  
Failure handling          etc...