

# How to Write Fast Code

18-645, spring 2008

26<sup>th</sup> Lecture, Apr. 21<sup>st</sup>

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# Course Evaluations

- Are open now
- Please fill it out

# Research Project

- Project expectations
- Paper templates and instructions on the website
- Poster template soon

April						
<i>Sun</i>	<i>Mon</i>	<i>Tue</i>	<i>Wed</i>	<i>Thu</i>	<i>Fri</i>	<i>Sat</i>
		1	2	3	4	5
6	7	8	9	10	11	12
13	14	15	16	17	18	19
20	21 	22	23	24	25 	26
27	28	29	30 			
						
						2008

- Today
- Papers due (6 pm)
- Last class:  
poster session  
Scaife Hall  
5:30 – 8:30 pm
- Due:
  - Final papers
  - Final code

# Today

- **Sorting**  
(Example of a non-numerical problem)

# Sorting

## ■ Fundamental problem in computer science

- Extensively studied
- Many different algorithms ([Wikipedia](#))

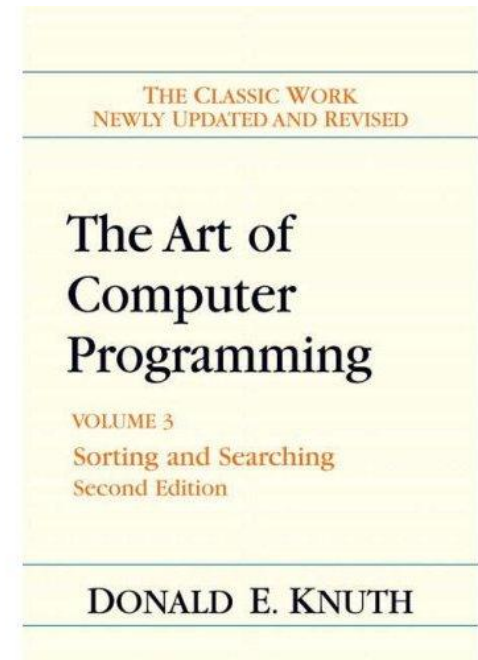
## ■ Comparison based algorithms

- Complexity:  $\Omega(n \log(n))$
- Quicksort
- Mergesort
- Insertion sort
- Sorting networks

## ■ Other algorithms

- Radix sort

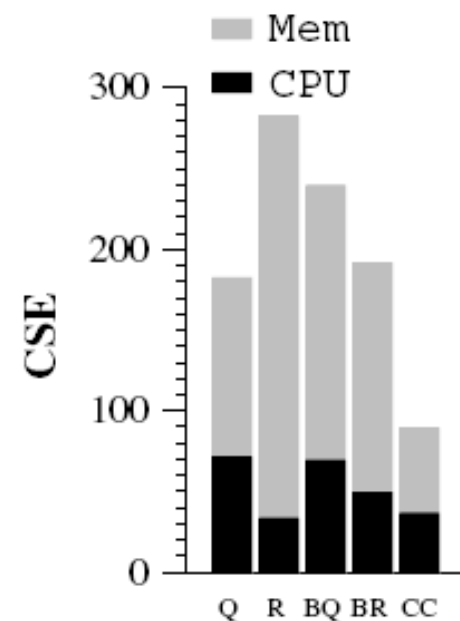
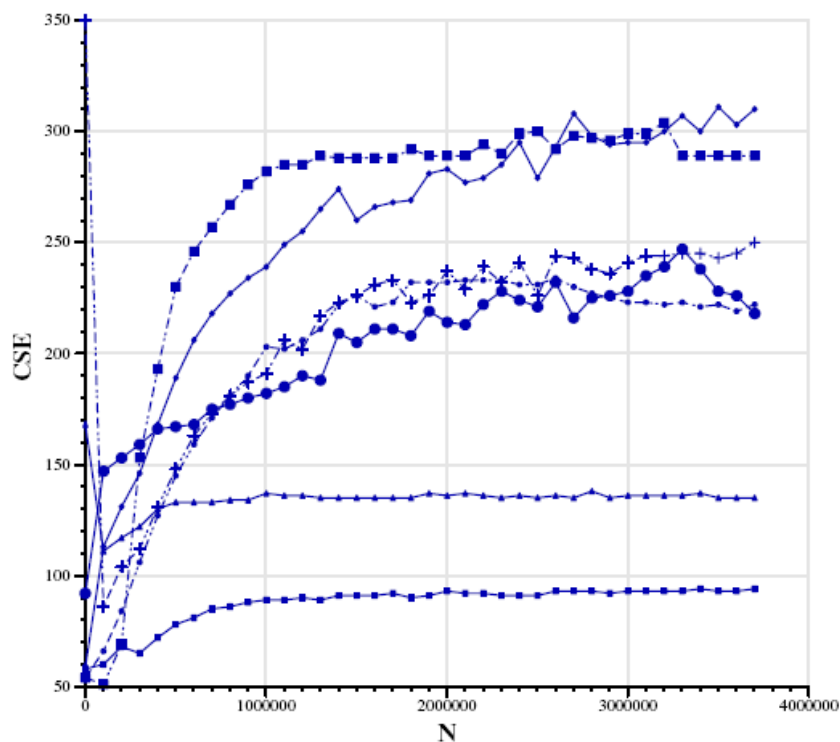
## ■ *How to make sorting fast?*



*Source: Amazon*

# Performance Issues

- Many algorithms to choose from
- Usually not optimized for the memory hierarchy

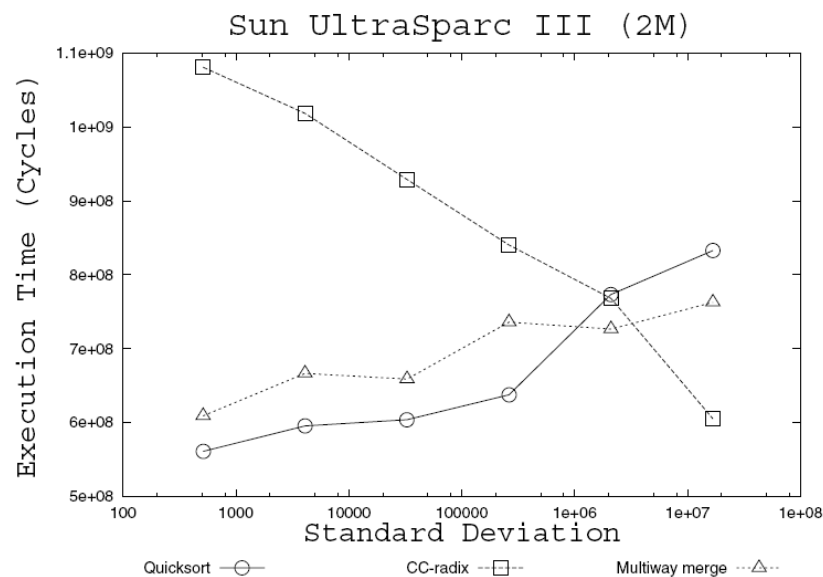
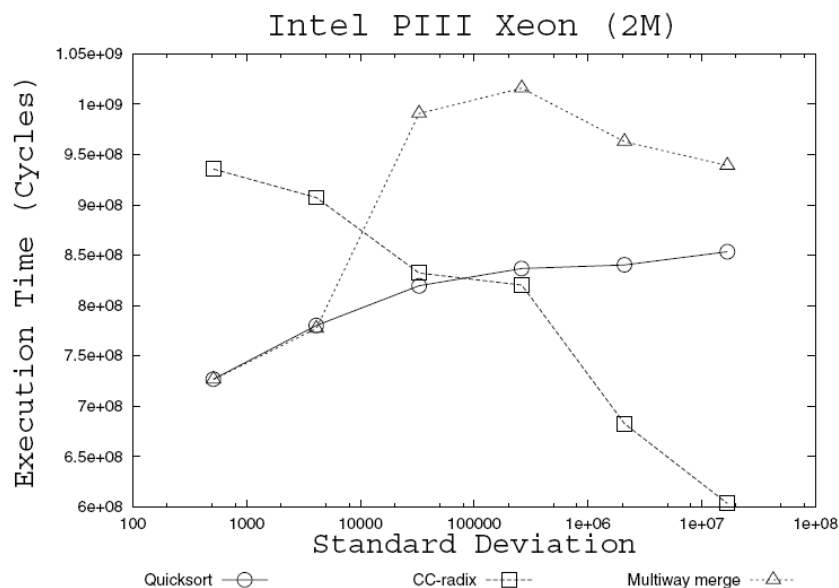


**Plots:** D. Jimenez-Gonzalez, J. Navarro, and J. Larriba-Pey. CC-Radix: A Cache Conscious Sorting Based on Radix Sort. In *Euromicro Conf. on Parallel Distributed and Network based Processing*, pp. 101–108, 2003

# Performance Issues

## ■ Performance may depend on

- the distribution of input data
- the computing platform



# Sorting Algorithms and Memory Hierarchy Optimizations

- Quicksort
- Mergesort
- Insertion sort
- Sorting networks
- Radix Sort
  
- Putting it together: **adaptive sorting**



# Quicksort (Hoare 1961)

- Start on blackboard
- One partitioning step (inplace version)

```
function partition(array, left, right, pivotIndex)
```

```
    pivotValue := array[pivotIndex]
```

```
    swap array[pivotIndex] and array[right] // Move pivot to end
```

```
    storeIndex := left
```

```
    for i from left to right // left ≤ i < right
```

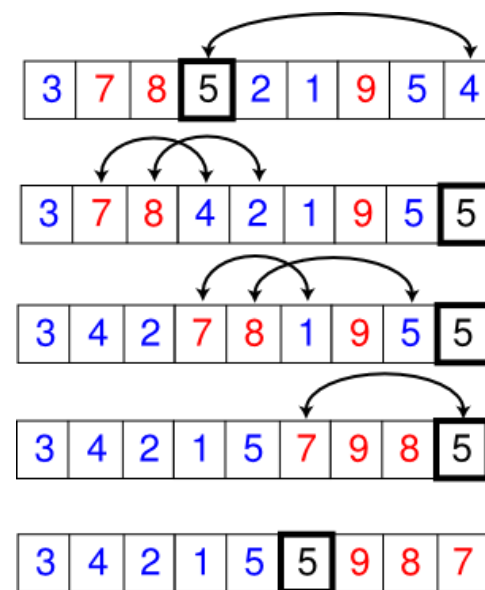
```
        if array[i] ≤ pivotValue
```

```
            swap array[i] and array[storeIndex]
```

```
            storeIndex := storeIndex + 1
```

```
            swap array[storeIndex] and array[right] // Move pivot to its final place
```

```
    return storeIndex
```



- Discussion: blackboard

# Mergesort (von Neumann 1945)

- Start on blackboard
- Merge function

```
function merge(left,right)
  var list result
  while length(left) > 0 and length(right) > 0
    if first(left) ≤ first(right)
      append first(left) to result
      left = rest(left)
    else
      append first(right) to result
      right = rest(right)
  if length(left) > 0
    append rest(left) to result
  if length(right) > 0
    append rest(right) to result
  return result
```

- Discussion: blackboard

# John von Neumann (1903-1957)

- Hungarian (later American citizen) genius
- Among the first four selected for the **Institute of Advanced Studies**, Princeton (with Gödel and Einstein)
- **Major contributions in:** set theory, functional analysis, quantum mechanics, ergodic theory, continuous geometry, economics and game theory, computer science, numerical analysis, hydrodynamics, statistics
  - Founded game theory and applied it to economics
  - Von Neumann computer architecture
  - Manhattan project



# Insertion Sort

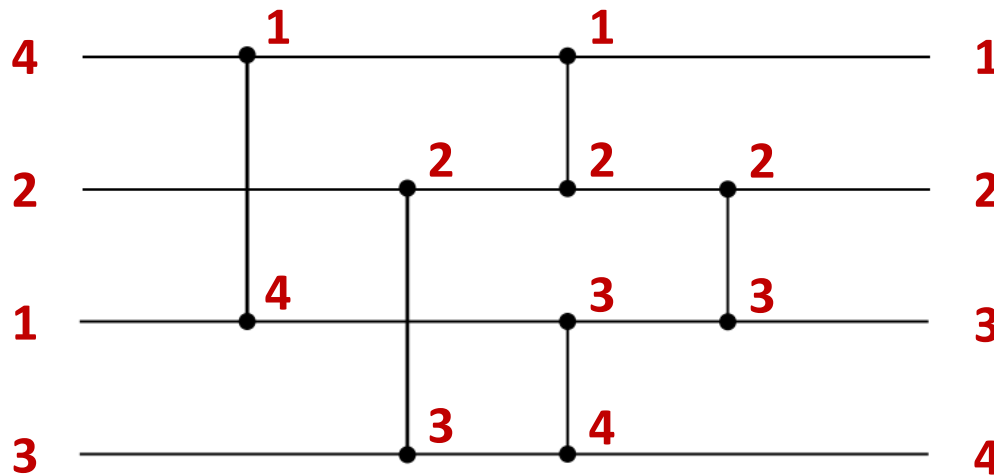
## ■ Pseudocode

```
function insertionSort(array A)
  for i = 1 to length[A]-1 do
    value = A[i]
    j = i-1
    while j >= 0 and A[j] > value do
      A[j + 1] = A[j]
      j = j-1
    A[j+1] = value
```

## ■ Discussion: blackboard

# Sorting Networks

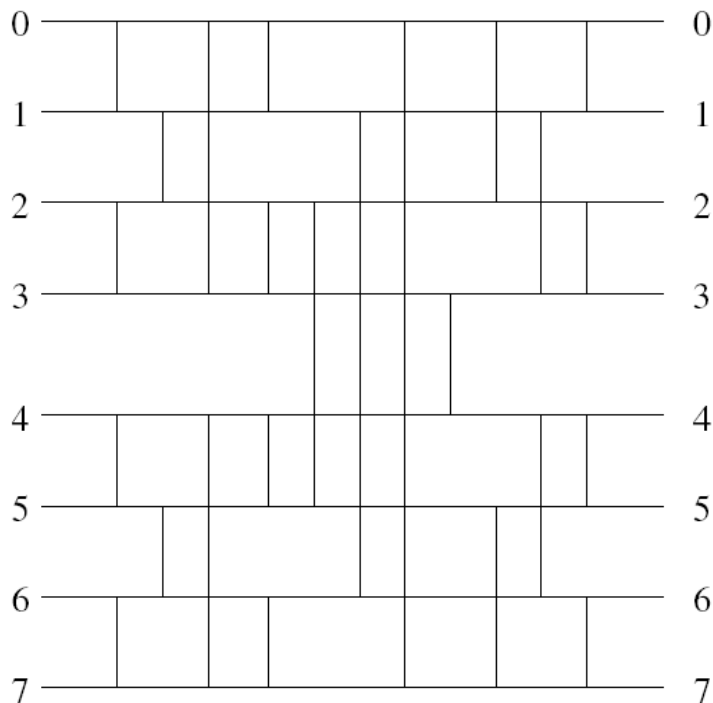
- Start on blackboard
- Example:  $N = 4$ , 5 comparators



- Discussion: blackboard

# Sorting Networks as Basic Blocks

## ■ Example



**network**

```

cmp&swap (r0, r1)
cmp&swap (r2, r3)
cmp&swap (r4, r5)
cmp&swap (r0, r3)
cmp&swap (r6, r7)
⋮
cmp&swap (r2, r3)
cmp&swap (r4, r5)
cmp&swap (r6, r7)
    
```

**unrolled code, scheduled  
 for instruction level parallelism**