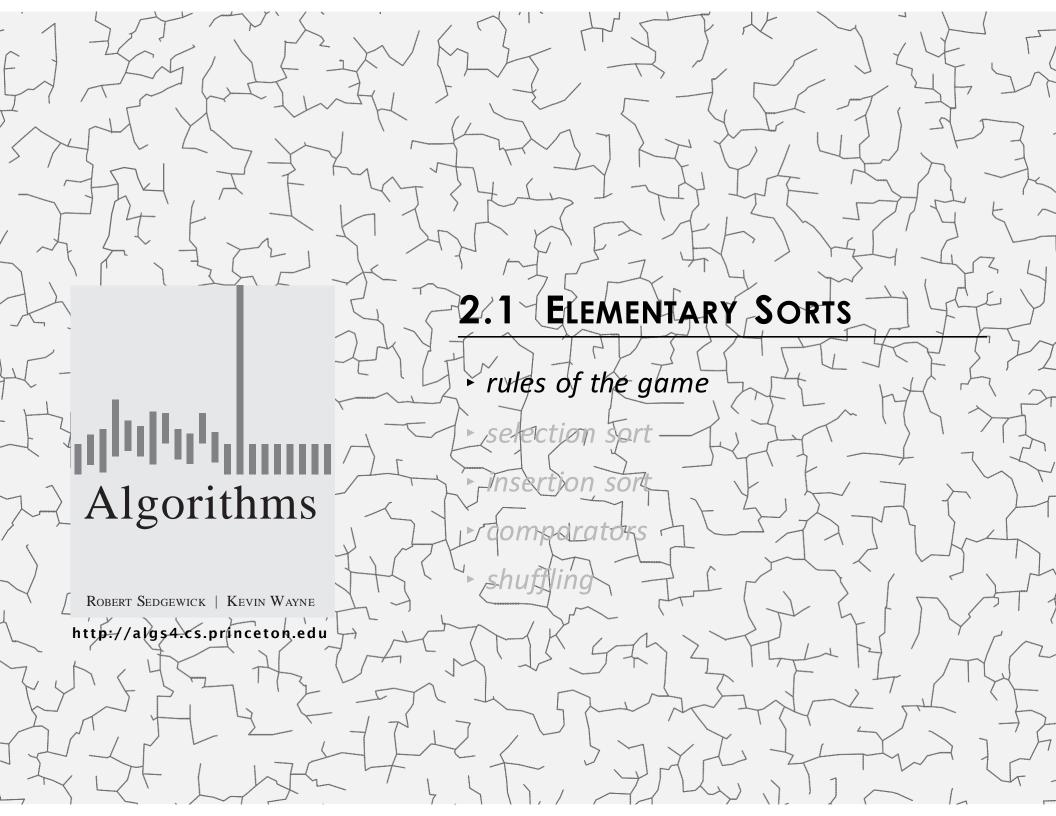


Topic for next two weeks: Sorting algorithms

Why?

- Analyzing sorting algorithm is a thorough introduction to the approach of the course of comparing algorithm performance
- Similar techniques are effective in addressing other problems
- We often use sorting algorithms as a starting point to solve other problems



Sorting problem

Ex. Student records in a university.

	Chen	3	Α	(991) 878-4944	308 Blair
	Rohde	2	Α	(232) 343-5555	343 Forbes
	Gazsi	4	В	(800) 867-5309	101 Brown
item	Furia	1	Α	(766) 093-9873	101 Brown
	Kanaga	3	В	(898) 122-9643	22 Brown
	Andrews	3	Α	(664) 480-0023	097 Little
key	Battle	4	С	(874) 088-1212	121 Whitman

Sort. Rearrange array of N items in ascending order by key.

Andrews	3	А	(664) 480-0023	097 Little
Battle	4	С	(874) 088-1212	121 Whitman
Chen	3	А	(991) 878-4944	308 Blair
Furia	1	А	(766) 093-9873	101 Brown
Gazsi	4	В	(800) 867-5309	101 Brown
Kanaga	3	В	(898) 122-9643	22 Brown
Rohde	2	Α	(232) 343-5555	343 Forbes

Sorting arrays vs. linked lists

We'll be exclusively concerned with sorting arrays.

- Q. Why not study how to sort linked lists?
- A. Most data we'll want to sort will be in an array anyway.
 - If it isn't, fastest way is to convert to array, sort, convert back.
 - Linked lists are typically used for dynamic data.
 - Sorting makes sense only for static data.
 - But what if we have values coming in dynamically and we want to keep the list sorted at all times?

second half of the course

Prerequisites

- Goal. Sort any type of data (for which sorting is well defined).
- Ex 1. Sort random real numbers in ascending order.
- Ex 2. Sort strings in alphabetical order.
- Ex 3. Sort the files in a given directory by filename.
- Ex 4. Sort dates in chronological order.

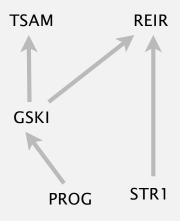
Requirement: total order

- Any two items v, w satisfy v < w or v = w or v > w
- There is no cycle of < relationships

Línuleg röðun Fullröðun



violates condition 2



violates condition 1

Goal. Sort any type of data (for which sorting is well defined).

Helper functions. Refer to data only through compares and exchanges.

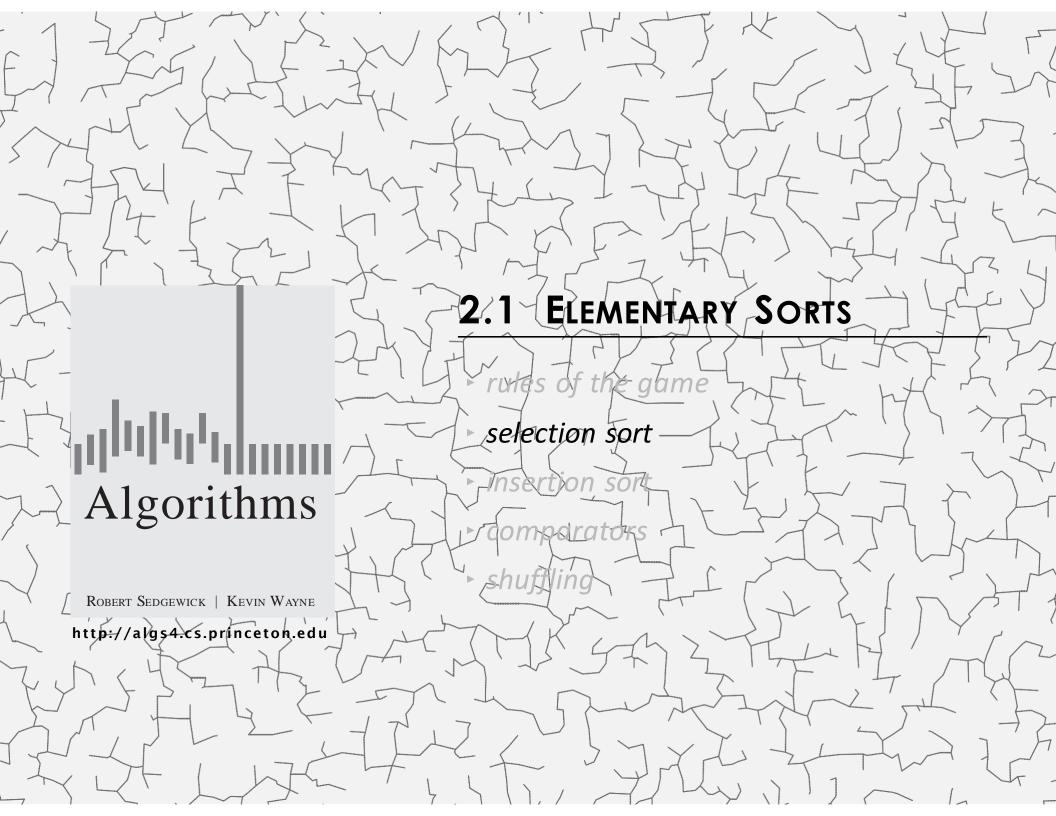
Less (magical for now). Is item v less than w?

```
private static boolean less(Object v, Object w)
{ ... }
```

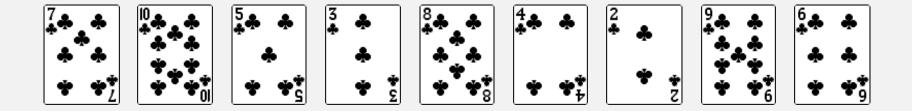
Exchange. Swap item in array a[] at index i with the one at index j.

víxla

```
private static void exch(Object[] a, int i, int j)
{
   Object swap = a[i];
   a[i] = a[j];
   a[j] = swap;
}
```



- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].



initial



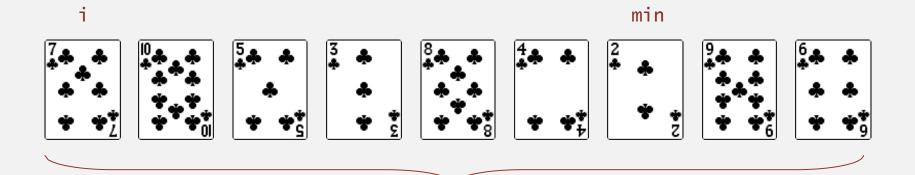
- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].



initial

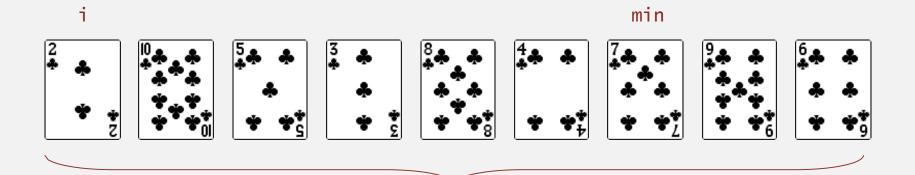
- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].

- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].



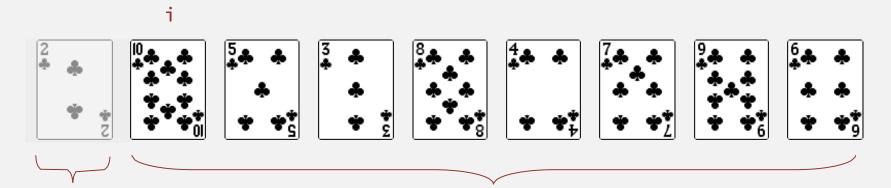
remaining entries

- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].



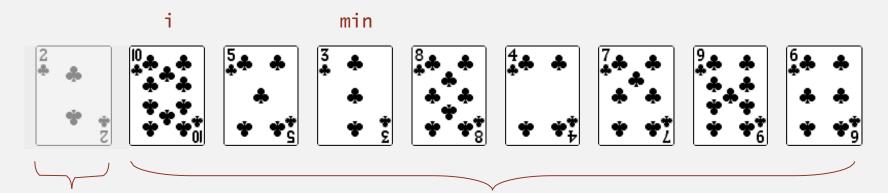
remaining entries

- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].



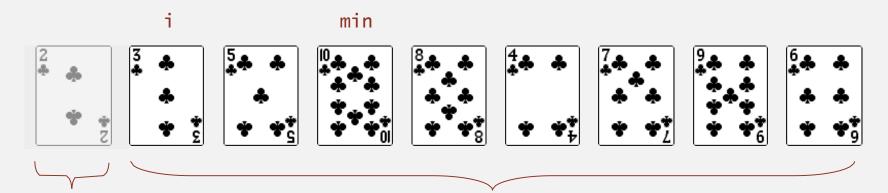
in final order

- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].



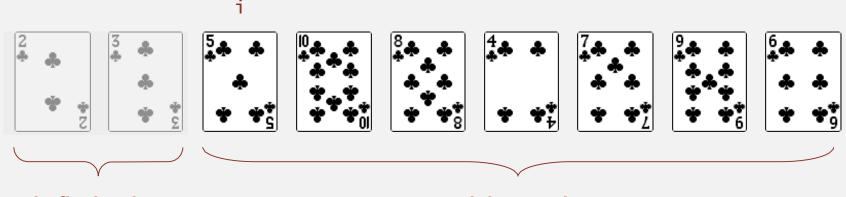
in final order

- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].



in final order

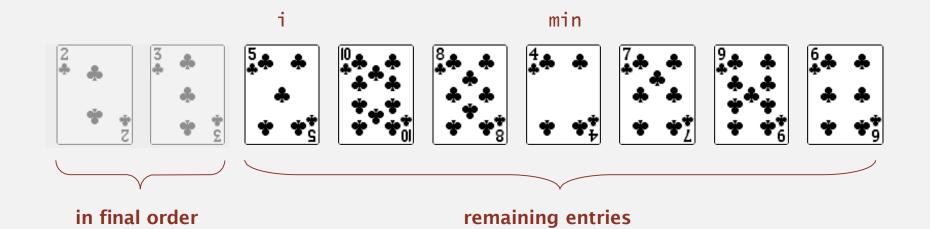
- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].



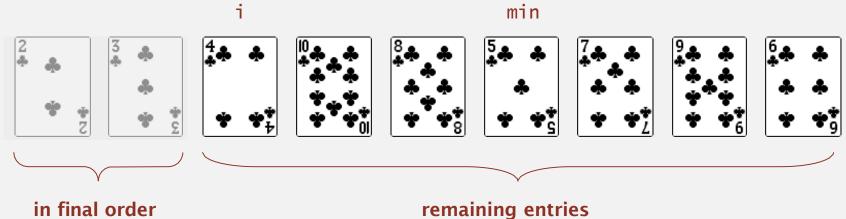
in final order

remaining entries

- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].

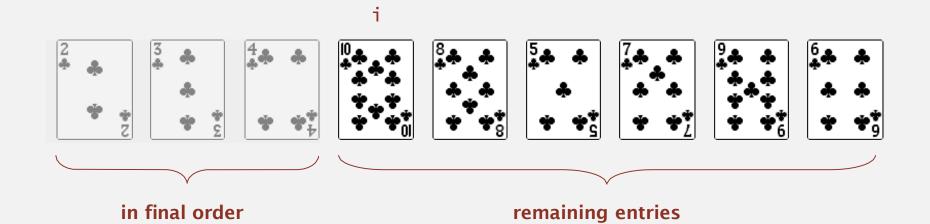


- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].

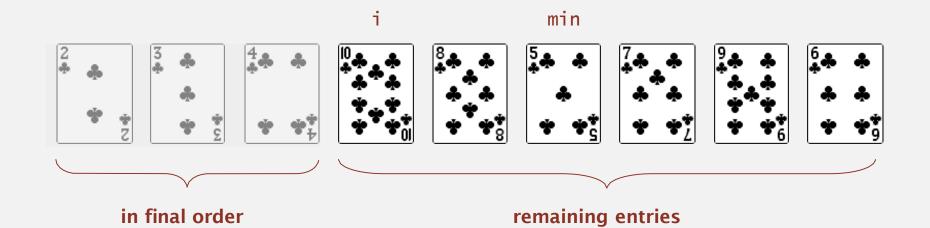


remaining entries

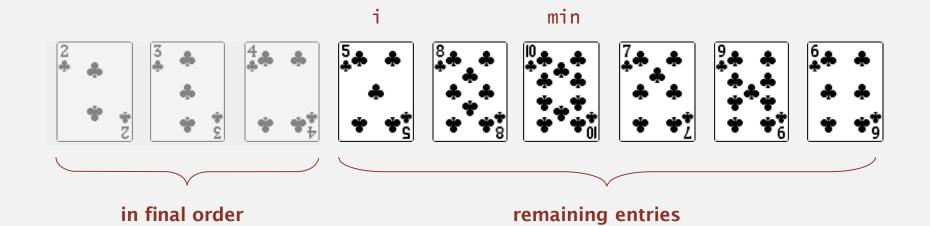
- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].



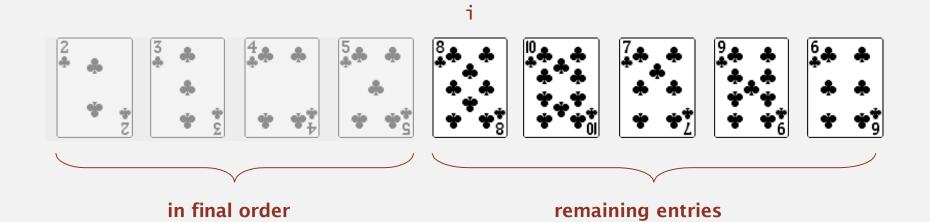
- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].



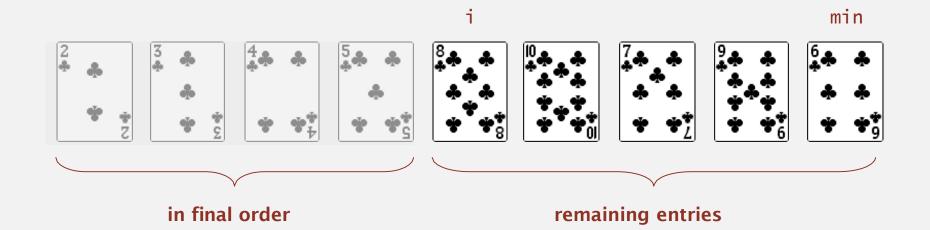
- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].



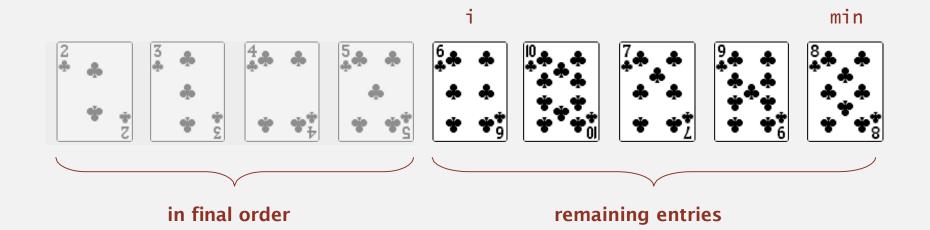
- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].



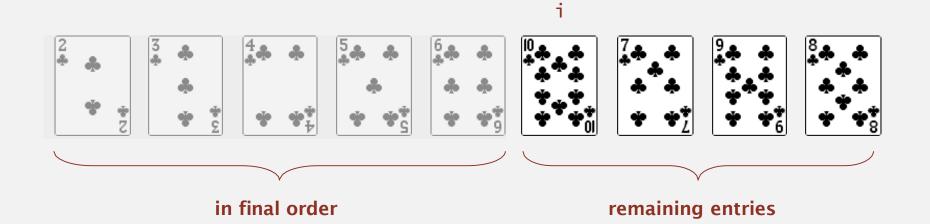
- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].



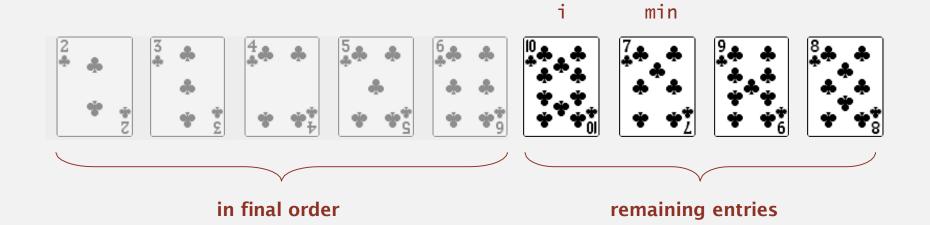
- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].



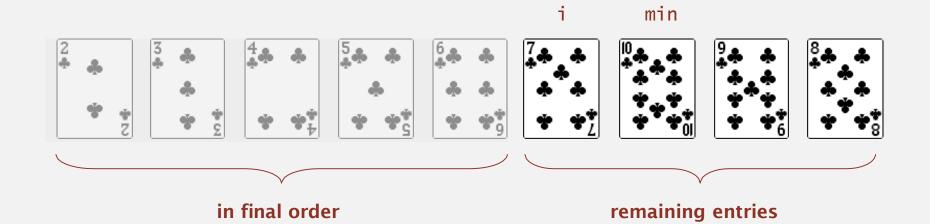
- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].



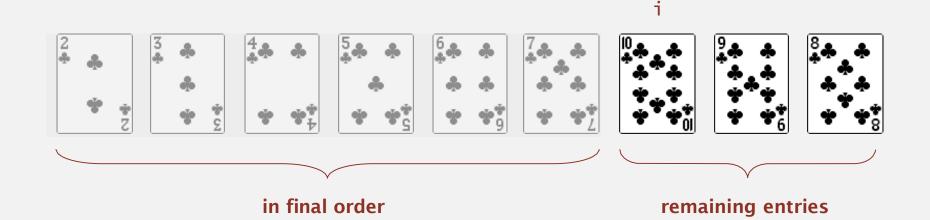
- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].



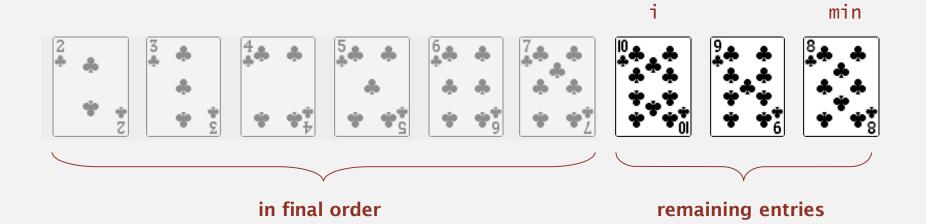
- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].



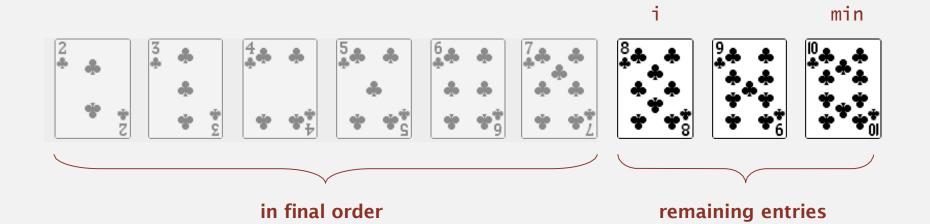
- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].



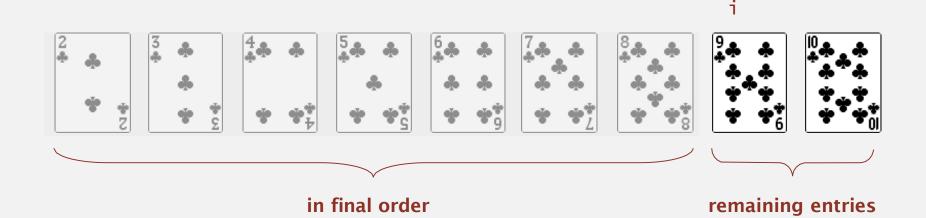
- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].



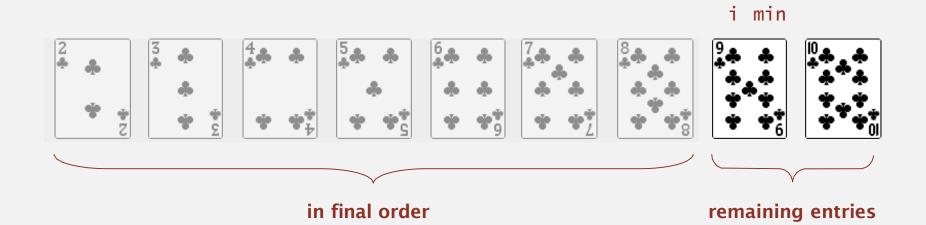
- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].



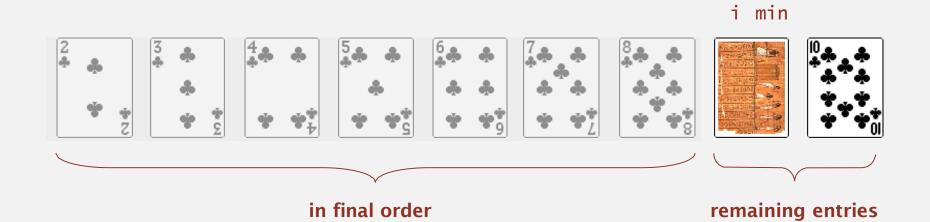
- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].



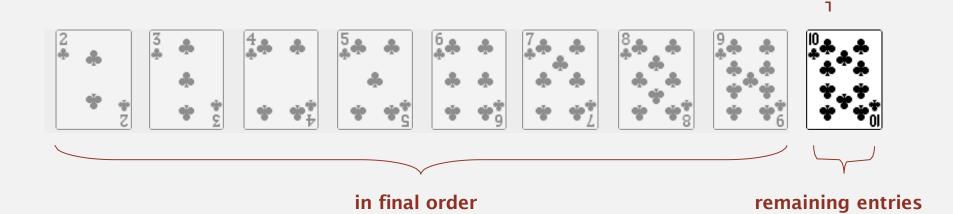
- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].



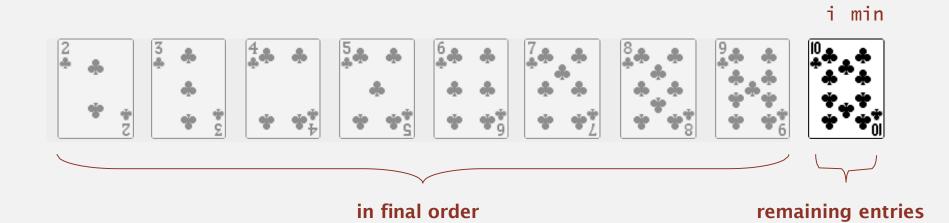
- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].



- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].

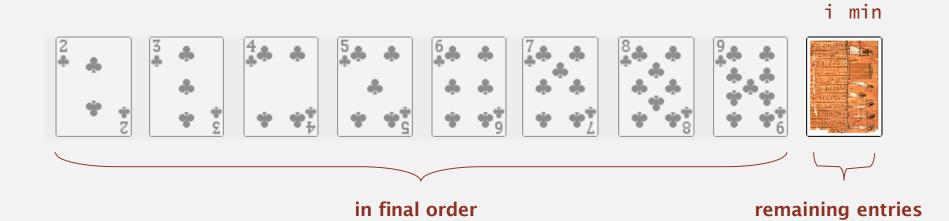


- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].



Selection sort demo

- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].



Selection sort demo

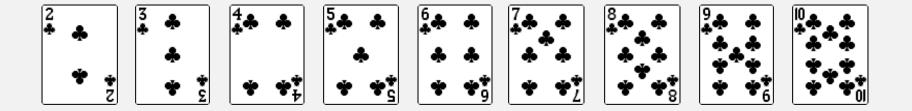
- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].



in final order

Selection sort demo

- In iteration i, find index min of smallest remaining entry.
- Swap a[i] and a[min].



sorted

Selection sort

Algorithm. ↑ scans from left to right.

Invariants.

fastayrðing

- Entries the left of \uparrow (including \uparrow) fixed and in ascending order.
- No entry to right of \uparrow is smaller than any entry to the left of \uparrow .



Selection sort inner loop

To maintain algorithm invariants:

Move the pointer to the right.

```
i++;
```

Identify index of minimum entry on right.

```
int min = i;
for (int j = i+1; j < N; j++)
  if (less(a[j], a[min]))
  min = j;</pre>
```





Exchange into position.

```
exch(a, i, min);
```

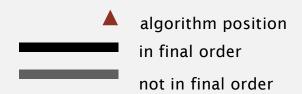


```
public class Selection
   public static void sort(Comparable[] a)
      int N = a.length;
      for (int i = 0; i < N; i++)
      {
         int min = i;
         for (int j = i+1; j < N; j++)
            if (less(a[j], a[min]))
               min = j;
         exch(a, i, min);
   }
  private static boolean less(Comparable v, Comparable w)
   { /* see Comparators section */ }
  private static void exch(Object[] a, int i, int j)
   { /* see earlier slide */ }
```

Selection sort: animations

20 random items

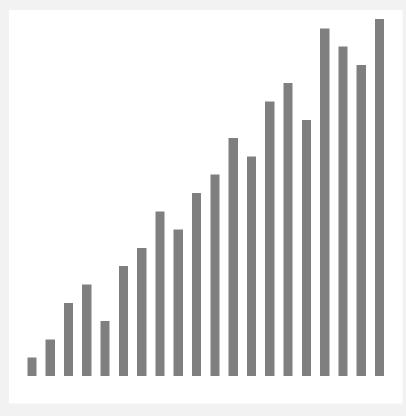




http://www.sorting-algorithms.com/selection-sort

Selection sort: animations

20 partially-sorted items





http://www.sorting-algorithms.com/selection-sort

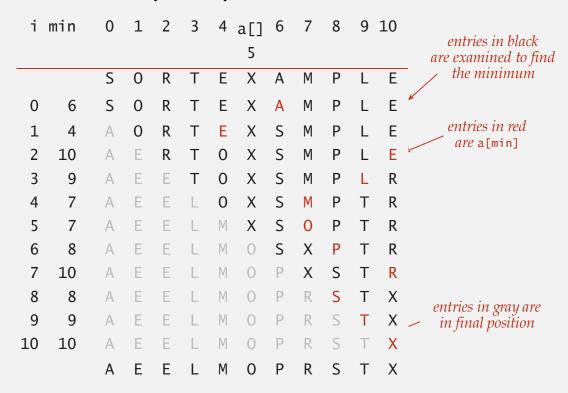
Elementary sorts: quiz 1

How many compares does selection sort make to sort an array of N keys?

- **A.** ~ *N*
- **B.** $\sim 1/4 N^2$
- C. $\sim 1/2 N^2$
- D. ~ N^2
- E. I don't know.

Selection sort: mathematical analysis

Proposition. Selection sort uses $(N-1) + (N-2) + ... + 1 + 0 \sim N^2/2$ compares and N exchanges to sort any array of N items.



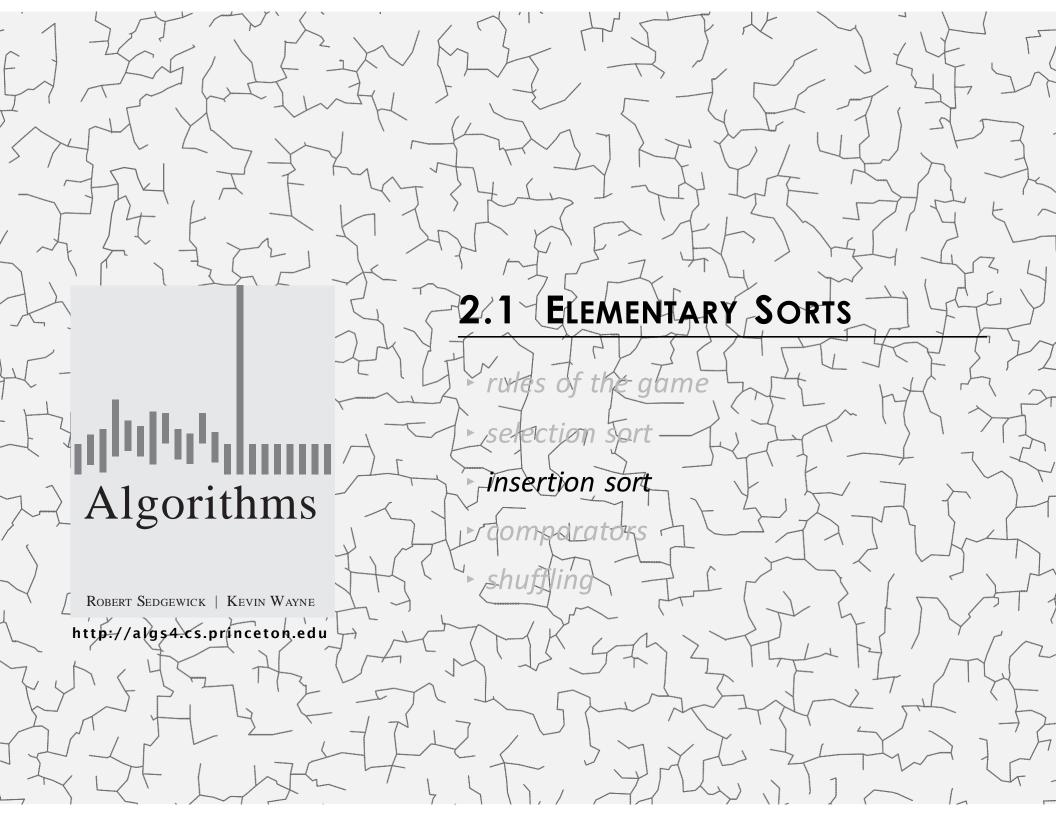
Trace of selection sort (array contents just after each exchange)

Running time insensitive to input. Quadratic time, even if input is sorted. Data movement is minimal. Linear number of exchanges—exactly N.

Selection sort with a gypsy folk-dance



https://www.youtube.com/watch?v=Ns4TPTC8whw



Insertion sort

Algorithm. ↑ scans from left to right.

Invariants.

- Entries to the left of ↑ (including ↑) are in ascending order.
- Entries to the right of ↑ have not yet been seen.



Insertion sort: inner loop

To maintain algorithm invariants:

Move the pointer to the right.



Moving from right to left, exchange
 a[i] with each larger entry to its left.

```
for (int j = i; j > 0; j--)
  if (less(a[j], a[j-1]))
      exch(a, j, j-1);
  else break;
```



```
public class Insertion
   public static void sort(Comparable[] a)
      int N = a.length;
      for (int i = 0; i < N; i++)
         for (int j = i; j > 0; j--)
            if (less(a[j], a[j-1]))
               exch(a, j, j-1);
            else break;
   }
   private static boolean less(Comparable v, Comparable w)
   { /* as before */ }
   private static void exch(Object[] a, int i, int j)
   { /* as before */ }
```

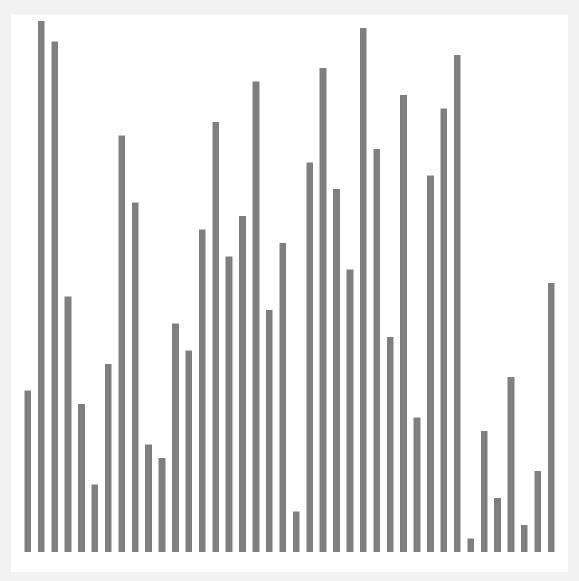
http://algs4.cs.princeton.edu/21elementary/Insertion.java.html

Insertion sort: animation

Demo at Algs4

Insertion sort: animation

40 random items





Insertion sort: mathematical analysis

Proposition. To sort a randomly-ordered array with distinct keys, insertion sort uses $\sim \frac{1}{4} N^2$ compares and $\sim \frac{1}{4} N^2$ exchanges on average.

Pf. Expect each entry to move halfway back.

i	j	0	1	2	3	4	a[]	6	7	8	9	10	
							5						
		S	0	R	Т	Ε	Χ	Α	М	Р	L	Ε	entries in gray
1	0	0	S	R	Т	Е	X	Α	\mathbb{N}	Р	L	Е	do not move
2	1	0	R	S	Т	Е	X	Α	M	Р	L	Е	
3	3	0	R	S	Т	Ε	X	Α	M	Р	L	Е	
4	0	Е	0	R	S	Т	X	Α	M	Р	L	Е	entry in red is a[j]
5	5	Е	0	R	S	Т	X	Α	M	Р	L	Е	ie alj
6	0	Α	Е	0	R	S	Т	Χ	\mathbb{N}	Р	L	Е	
7	2	Α	Е	M	0	R	S	Т	Χ	Р	L	Е	entries in black
8	4	Α	Е	M	0	P	R	S	Т	Χ	L	E	moved one position
9	2	Α	Ε	L	М	0	Р	R	S	Т	Χ	E	right for insertion
10	2	Α	Е	Е	L	M	0	Р	R	S	Т	Χ	
		Α	Ε	Ε	L	M	0	Р	R	S	Т	Χ	

Trace of insertion sort (array contents just after each insertion)

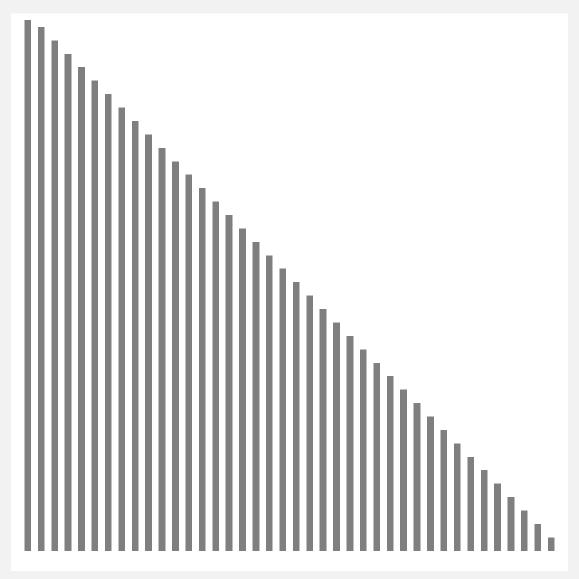
Elementary sorts: quiz 2

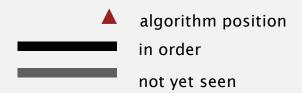
How many compares does insertion sort make to sort an array of N distinct keys in reverse order?

- **A.** ~ *N*
- **B.** $\sim 1/4 N^2$
- C. $\sim 1/2 N^2$
- D. $\sim N^2$
- *E. I don't know.*

Insertion sort: animation

40 reverse-sorted items





Elementary sorts: quiz 2b

How many compares does insertion sort make to sort an array of N distinct keys in sorted order?

- **A.** ~ *N*
- **B.** $\sim 1/4 N^2$
- C. $\sim 1/2 N^2$
- D. $\sim N^2$
- *E. I don't know.*

Insertion sort: analysis

Worst case. If the array is in descending order (and no duplicates), insertion sort makes $\sim \frac{1}{2} N^2$ compares and $\sim \frac{1}{2} N^2$ exchanges.

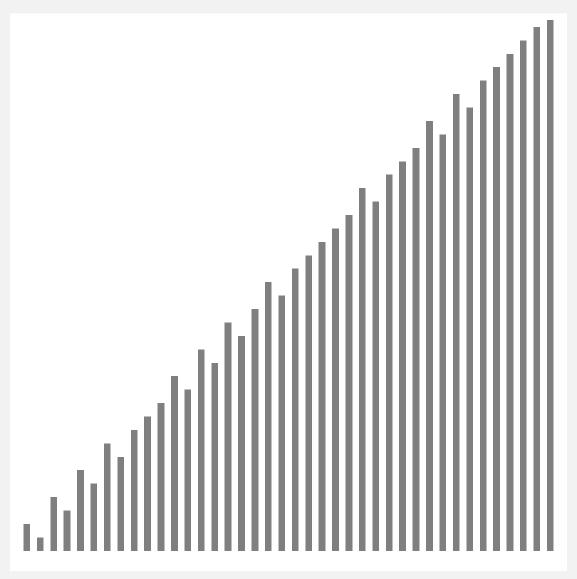
XTSRPOMLFEA

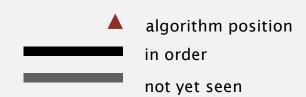
Best case. If the array is in ascending order, insertion sort makes N-1 compares and 0 exchanges.

AEELMOPRSTX

Insertion sort: animation

40 partially-sorted items





Insertion sort: partially sorted arrays

Def. An inversion is a pair of keys that are out of order.

Def. An array is partially sorted if the number of inversions is $\leq c N$.

- Ex 1. A sorted array has 0 inversions.
- Ex 2. A subarray of size 10 appended to a sorted subarray of size N.

Proposition. For partially-sorted arrays, insertion sort runs in linear time.

Pf. Number of exchanges equals the number of inversions.

number of compares \leq exchanges + (N - 1)

Insertion sort: practical improvements

Half exchanges. Shift items over (instead of exchanging).

- Eliminates unnecessary data movement.
- No longer uses only less() and exch() to access data.

Binary insertion sort. Use binary search to find insertion point.

- Number of compares $\sim N \lg N$.
- But still a quadratic number of array accesses.



Elementary sorts: quiz 3

Which is faster in practice, selection sort or insertion sort?

- A. Selection sort.
- B. Insertion sort.
 - C. No significant difference.
 - **D.** I don't know.

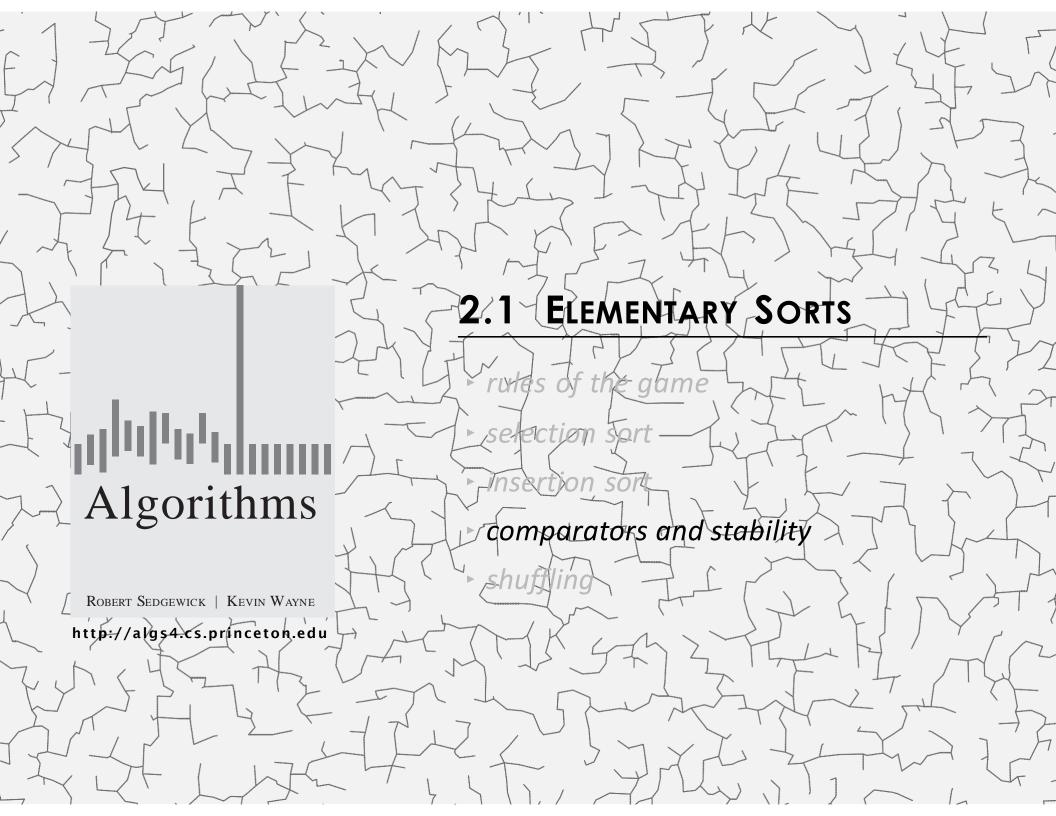
Also faster in theory if our cost model incorporates the assumption that comparing two objects is almost always slower than swapping two pointers.

Insertion sort with Romanian folk dance

• In iteration i, swap a[i] with each larger entry to its left.



https://www.youtube.com/watch?v=ROalU379I3U



Callbacks

Goal. Sort any type of data (for which sorting is well defined).

Q. How can sort() compare data of type Double, String, java.io.File, or user-defined type without hardwiring in type-specific information?

A. Client object must implement an interface (comparable).

- Client passes array of objects to sort() function.
- The sort() function calls object's compareTo() method as needed.

This is a callback. Client calls sort() and sort() calls client code back.

Implementing callbacks.

- Java: interfaces
- C: function pointers
- C++: class-type functors
- C#: delegates
- Python, Perl, ML, Javascript: first-class functions

Interface. Specifies a set of methods that a concrete class can provide.

```
public interface Comparable<Item>
{
    public int compareTo(Item that);
}

contract: one method
    with this signature
    and prescribed behavior
```

Concrete class. Can provide the set of methods in the interface.

"polymorphism"

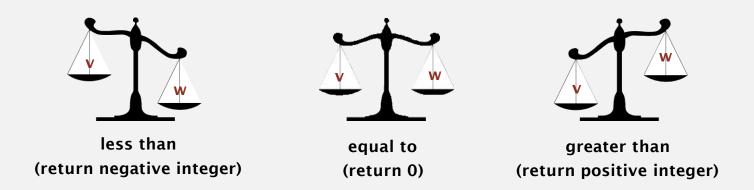
Impact.

- You can treat any String object as an object of type Comparable.
- On a Comparable object, you can invoke the compareTo() method.
- Enables callbacks.

java.lang.Comparable API

Implement compareTo() so that v.compareTo(w)

- Defines a total order.
- Returns a negative integer, zero, or positive integer if v is less than, equal to, or greater than w, respectively.
- Throws an exception if incompatible types (or either is null).



Built-in comparable types. Integer, Double, String, Date, File, ... User-defined comparable types. Implement the Comparable interface.

Comparable interface: overview

client (StringSorter.java)

```
public class StringSorter
{
   public static void main(String[] args)
   {
      String[] a = StdIn.readAllStrings();
      Insertion.sort(a);
      for (int i = 0; i < a length; i++)
            StdOut.println(a[i]);
   }
}</pre>
```

java.lang.Comparable interface

```
public interface Comparable<Item>
{
   public int compareTo(Item that);
}
```

sort implementation (Insertion.java)

```
public static void sort(Comparable[] a)
{
   int N = a.length;
   for (int i = 0; i < N; i++)
      for (int j = i; j > 0; j--)
        if (a[j].compareTo(a[j-1]) < 0)
        exch(a, j, j-1);
      else break;
}</pre>
```

data type implementation (String.java)

```
public class String
implements Comparable<String>
{
    ...
    public int compareTo(String that)
    {
        ...
    }
}
```

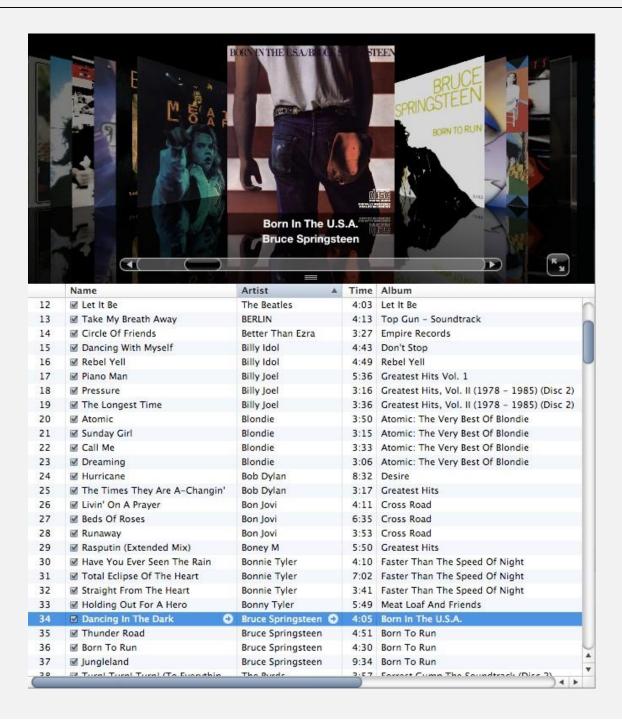
key point: no dependence on type of data to be sorted

Implementing the Comparable interface: example

Date data type. Simplified version of java.util.Date.

```
public class Date implements Comparable<Date>
{
   private final int month, day, year;
   public Date(int m, int d, int y)
                                                          can compare Date objects
      month = m;
                                                         only to other Date objects
      day = d;
      year = y;
   public int compareTo(Date that)
      if (this.year < that.year ) return -1;
      if (this.year > that.year ) return +1;
      if (this.month < that.month) return -1;
      if (this.month > that.month) return +1;
      if (this.day < that.day ) return -1;
      if (this.day > that.day ) return +1;
      return 0:
}
```

Sort music library by artist



Sort music library by song name



Comparable interface: sort using a type's natural order.

```
public class Date implements Comparable<Date>
   private final int month, day, year;
   public Date(int m, int d, int y)
      month = m;
      day = d:
      year = y:
   public int compareTo(Date that)
                                                         natural order
      if (this.year < that.year ) return -1;
      if (this.year > that.year ) return +1;
      if (this.month < that.month) return -1;
      if (this.month > that.month) return +1;
      if (this.day < that.day ) return -1;
      if (this.day > that.day ) return +1;
      return 0;
```

Comparator interface

Comparator interface: sort using an alternate order.

samberi

```
public interface Comparator<Item>
{
    public int compare(Item v, Item w);
}
```

Required property. Must be a total order.

string order	example		
natural order	Now is the time pre-1994 order for		
case insensitive	is Now the time		
Spanish language	café cafetero cuarto churro nube ñoño		
British phone book	McKinley Mackintosh		

To use with Java system sort:

- Create Comparator object.
- Pass as second argument to Arrays.sort().

```
String[] a; uses natural order uses alternate order defined by Comparator<String> object
...
Arrays.sort(a);
...
Arrays.sort(a, String.CASE_INSENSITIVE_ORDER);
...
Arrays.sort(a, Collator.getInstance(new Locale("es")));
...
Arrays.sort(a, new BritishPhoneBookOrder());
...
```

Bottom line. Decouples the definition of the data type from the definition of what it means to compare two objects of that type.

Comparator interface: using with our sorting libraries

To support comparators in our sort implementations:

- Pass Comparator to both sort() and less(), and use it in less().
- Use Object instead of Comparable.

```
import java.util.Comparator;
public class Insertion
   public static void sort(Object[] a, Comparator comparator)
      int N = a.length;
      for (int i = 0; i < N; i++)
         for (int j = i; j > 0 && less(comparator, a[j], a[j-1]); j--)
            exch(a, i, i-1):
   private static boolean less(Comparator comparator, Object v, Object w)
   { return comparator.compare(v, w) < 0; }</pre>
```

To implement a comparator:

- Define a (nested) class that implements the Comparator interface.
- Implement the compare() method.
- Provide client access to Comparator.

```
import java.util.Comparator;
public class Student
   private final String name;
   private final int section;
                          one Comparator for the class
   public static Comparator<Student> nameOrder()
     return new NameOrder(); }
   private static class NameOrder implements Comparator<Student>
      public int compare(Student v, Student w)
         return v.name.compareTo(w.name);
```

Comparator interface: implementing

To implement a comparator:

- Define a (nested) class that implements the Comparator interface.
- Implement the compare() method.
- Provide client access to Comparator.

```
import java.util.Comparator;
public class Student
   private final String name;
   private final int section;
   public static Comparator<Student> sectionOrder()
   { return new SectionOrder(); }
   private static class SectionOrder implements Comparator<Student>
      public int compare(Student v, Student w)
         return v.section - w.section;
                                this trick works here
                             since no danger of overflow
```

Comparator interface: implementing

To implement a comparator:

- Define a (nested) class that implements the Comparator interface.
- Implement the compare() method.
- Provide client access to Comparator.

Insertion.sort(a, Student.nameOrder());

Andrews	3	Α	(664) 480-0023	097 Little
Battle	4	С	(874) 088-1212	121 Whitman
Chen	3	А	(991) 878-4944	308 Blair
Fox	3	Α	(884) 232-5341	11 Dickinson
Furia	1	А	(766) 093-9873	101 Brown
Gazsi	4	В	(800) 867-5309	101 Brown
Kanaga	3	В	(898) 122-9643	22 Brown
Rohde	2	Α	(232) 343-5555	343 Forbes

Insertion.sort(a, Student.sectionOrder());

Furia	1	А	(766) 093-9873	101 Brown
Rohde	2	Α	(232) 343-5555	343 Forbes
Andrews	3	А	(664) 480-0023	097 Little
Chen	3	Α	(991) 878-4944	308 Blair
Fox	3	Α	(884) 232-5341	11 Dickinson
Kanaga	3	В	(898) 122-9643	22 Brown
Battle	4	С	(874) 088-1212	121 Whitman
Gazsi	4	В	(800) 867-5309	101 Brown

Stability

A typical application. First, sort by name; then sort by section.

Selection.sort(a, Student.nameOrder());

Andrews	3	Α	(664) 480-0023	097 Little
Battle	4	С	(874) 088-1212	121 Whitman
Chen	3	А	(991) 878-4944	308 Blair
Fox	3	Α	(884) 232-5341	11 Dickinson
Furia	1	А	(766) 093-9873	101 Brown
Gazsi	4	В	(800) 867-5309	101 Brown
Kanaga	3	В	(898) 122-9643	22 Brown
Rohde	2	А	(232) 343-5555	343 Forbes

Selection.sort(a, Student.sectionOrder());

Furia	1	А	(766) 093-9873	101 Brown
Rohde	2	А	(232) 343-5555	343 Forbes
Chen	3	Α	(991) 878-4944	308 Blair
Fox	3	Α	(884) 232-5341	11 Dickinson
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Kanaga	3	В	(898) 122-9643	22 Brown
Gazsi	4	В	(800) 867-5309	101 Brown
Battle	4	С	(874) 088-1212	121 Whitman

@#%&@! Students in section 3 no longer sorted by name.

A stable sort preserves the relative order of items with equal keys.

Elementary sorts: quiz 4

Which sorting algorithms are stable?

- A. Selection sort.
- **B.** Insertion sort.
- C. Both A and B.
- D. Neither A nor B.
- E. I don't know.

Proposition. Insertion sort is stable.

```
public class Insertion
     public static void sort(Comparable[] a)
          int N = a.length;
          for (int i = 0; i < N; i++)
               for (int j = i; j > 0 && less(a[j], a[j-1]); j--)
                    exch(a, j, j-1);
                                             0 \quad B_1 \quad A_1 \quad A_2 \quad A_3 \quad B_2
                                             0 A<sub>1</sub> B<sub>1</sub> A<sub>2</sub> A<sub>3</sub> B<sub>2</sub>
                                     2 \qquad 1 \qquad A_1 \quad A_2 \quad B_1 \quad A_3 \quad B_2
                                     3 \qquad 2 \qquad A_1 \quad A_2 \quad A_3 \quad B_1 \quad B_2
                                         4 A<sub>1</sub> A<sub>2</sub> A<sub>3</sub> B<sub>1</sub> B<sub>2</sub>
                                                   A_1 A_2 A_3 B_1 B_2
```

Pf. Equal items never move past each other.

Stability: Selection sort

Proposition. Selection sort is not stable.

```
public class Selection
{
   public static void sort(Comparable[] a)
   {
     int N = a.length;
     for (int i = 0; i < N; i++)
        {
        int min = i;
        for (int j = i+1; j < N; j++)
            if (less(a[j], a[min]))
            min = j;
        exch(a, i, min);
     }
}</pre>
```

```
        i
        min
        0
        1
        2

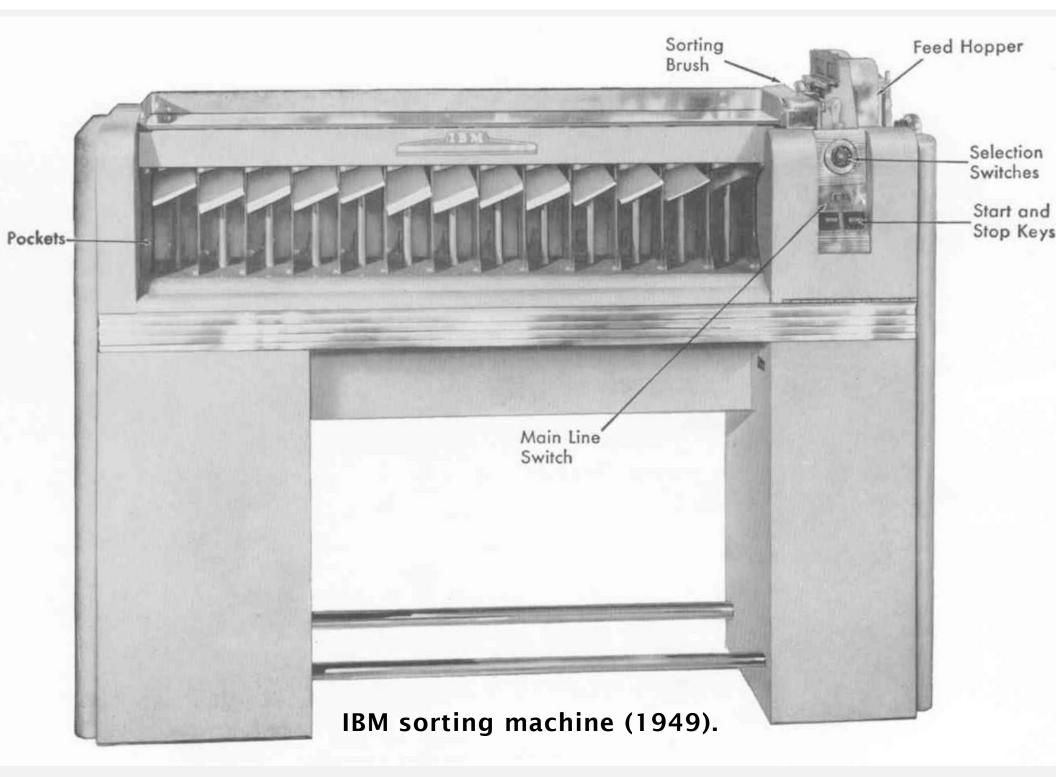
        0
        2
        B<sub>1</sub>
        B<sub>2</sub>
        A

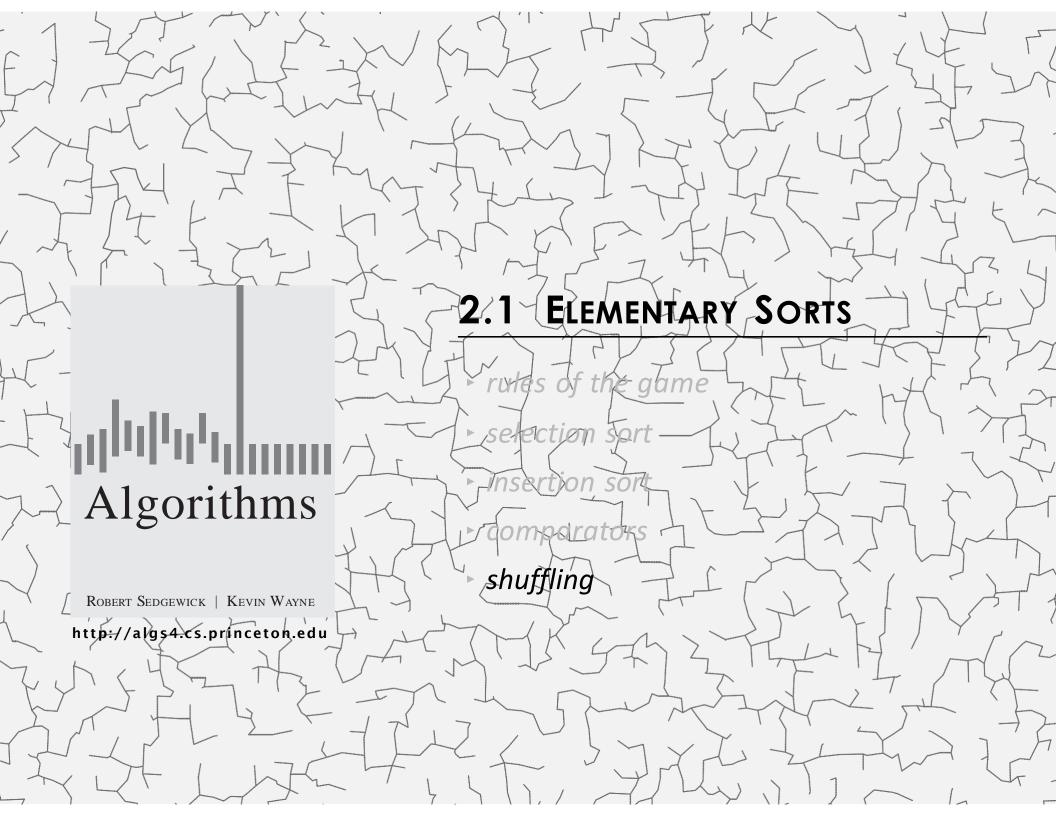
        1
        1
        A
        B<sub>2</sub>
        B<sub>1</sub>

        2
        2
        A
        B<sub>2</sub>
        B<sub>1</sub>

        A
        B<sub>2</sub>
        B<sub>1</sub>
```

Pf by counterexample. Long-distance exchange can move one equal item past another one.



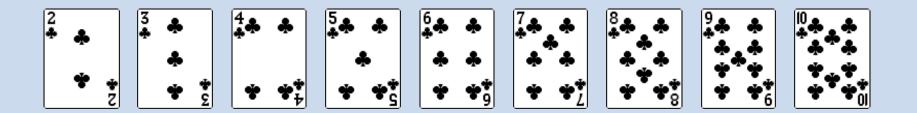


Interview question: shuffle an array

Goal. Rearrange array so that result is a uniformly random permutation.

all N! permutations

II N! permutations equally likely

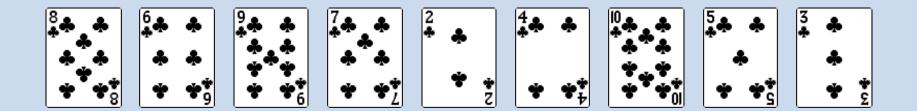


Interview question: shuffle an array

Goal. Rearrange array so that result is a uniformly random permutation.

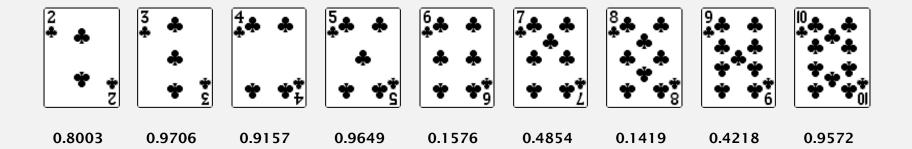
all N! permutations

II N! permutations equally likely



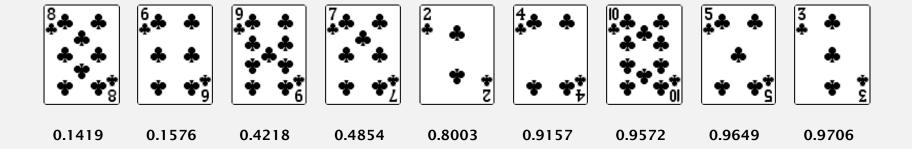
Shuffling by sorting

- Generate a random real number for each array entry.
- Sort the array.



Shuffling by sorting

- Generate a random real number for each array entry.
- Sort the array.



War story (Microsoft)

Microsoft antitrust probe by EU. Microsoft agreed to provide a randomized ballot screen for users to select browser in Windows 7.

http://www.browserchoice.eu

Select your web browser(s)



A fast new browser from Google. Try it now!



Safari for Windows from Apple, the world's most innovative browser.



Your online security is Firefox's top priority. Firefox is free, and made to help you get the most out of the



The fastest browser on Earth. Secure, powerful and easy to use, with excellent privacy protection.



Designed to help you take control of your privacy and browse with confidence. Free from Microsoft.

appeared last 50% of the time

War story (Microsoft)

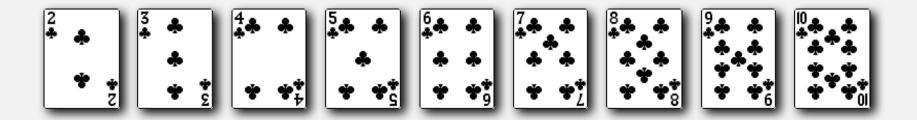
Microsoft antitrust probe by EU. Microsoft agreed to provide a randomized ballot screen for users to select browser in Windows 7.

Solution? Implement shuffling-by-sorting by making comparator always return a random answer.

```
public int compareTo(Browser that)
{
   double r = Math.random();
   if (r < 0.5) return -1;
   if (r > 0.5) return +1;
   return 0;
}
browser comparator
   (should implement a total order)
```

Knuth shuffle

- In iteration i, pick integer r between 0 and i uniformly at random.
- Swap a[i] and a[r].

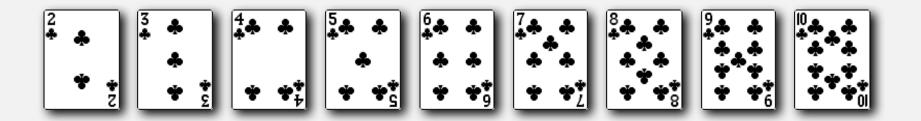


Proposition. [Fisher-Yates 1938] Knuth shuffling algorithm produces a uniformly random permutation of the input array in linear time.

Knuth shuffle

- In iteration i, pick integer r between 0 and i uniformly at random.
- Swap a[i] and a[r].

common bug: between 0 and N - 1



Proposition. [Fisher-Yates 1938] Knuth shuffling algorithm produces a uniformly random permutation of the input array in linear time.

War story (online poker)

Texas hold'em poker. Software must shuffle electronic cards.



How We Learned to Cheat at Online Poker: A Study in Software Security http://www.cigital.com/papers/download/developer_gambling.php

War story (online poker)

Shuffling algorithm in FAQ at www.planetpoker.com

```
for i := 1 to 52 do begin
    r := random(51) + 1;
    swap := card[r];
    card[r] := card[i];
    card[i] := swap;
end;
```

- Bug 1. Random number r never $52 \Rightarrow 52^{nd}$ card can't end up in 52^{nd} place.
- Bug 2. Shuffle not uniform (should be between 1 and i).
- Bug 3. random() uses 32-bit seed $\Rightarrow 2^{32}$ possible shuffles
- Bug 4. Seed = milliseconds since midnight: 86.4 million shuffles
 - " The generation of random numbers is too important to be left to chance."
 - Robert R. Coveyou

War story (online poker)

Best practices for shuffling (if your business depends on it).

- Use a hardware random-number generator that has passed both the FIPS 140-2 and the NIST statistical test suites.
- Continuously monitor statistic properties:
 hardware random-number generators are fragile and fail silently.
- Use an unbiased shuffling algorithm.





RANDOM.ORG

Bottom line. Shuffling a deck of cards is hard!