CS2010: Data Structures and Algorithms II

Strings

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Outline of String algorithms

- > String sorting algorithms
 - Exploit properties of strings to speed up sorting
 - Radix sort
- > Tries
 - Data structures for searching with string keys more efficient than general purpose ones previously discussed, eg hashtables, search trees
- > Substring search
 - Interesting problem- multiple approaches illustrating different algorithm design techniques
- > Regular expressions
 - Searching for incomplete patterns rather than exact substrings
- > Data compression
 - Save storage, faster network transfer
 - Run length encoding, Huffman compression

What are strings?

- > Sequences of characters
 - Text
 - Genome sequences
- > What are characters then?
 - In C char data type is 8 bit integer, 7-bit ascii, 256 characters max
 - In Java char data type, 16 bit unsigned int, range '\u0000' to '\uffff' (0 to 65,535)

java.lang.String

- > Immutable sequence of characters
- > Implements Comparable
- > Implements CharSequences
 - Methods length() number of characters
 - charAt(i) returns the i-th character
 - Concatenation- concatenate one string to the end of another java.lang.String
 - Substring extract a subsequence of characters

Immutable?

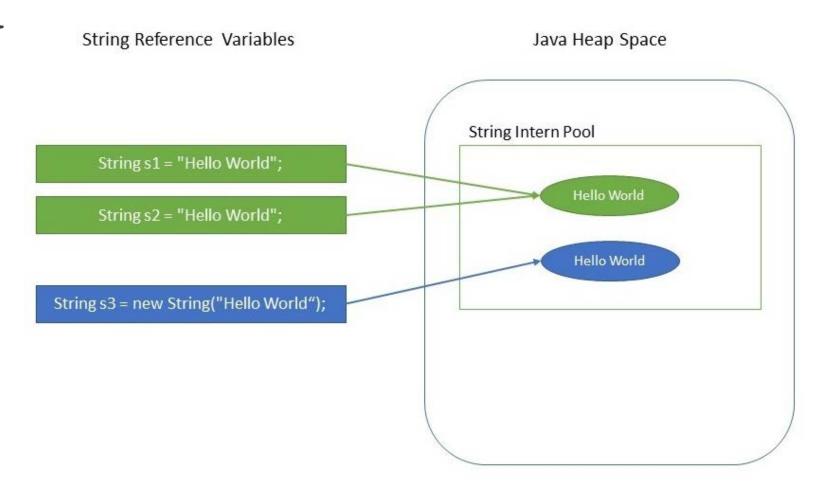
- > String cannot be modified
- > What happens here then?

```
String test = "blah";
test = "meh";
System.out.println(test); //what does this print?
```

New string is created and reference test now points to it instead of the old one – reference to "blah" text has been lost, it's still unchanged somewhere in memory

Memory leaks/garbage collection

String pool



https://www.baeldung.com/java-string-immutable

Other implications of immutability

> Security

Parameters in many methods which could introduce vulnerability
 security threats, eg network connection is passed a string – it could be modified to connect to a different machine, or a modified file name can be passed in etc

> Thread-safe

- No need for synchronisation if shared between threads no thread can modify it
- > Can be used as keys in symbol tables
- > Can calculate and save hashcode efficiency
- > https://www.baeldung.com/java-string-immutable

String implementation

char [] value

int length - saved for efficiency so it doesn't have to be calculated every time we need it

```
int hash - calculated as s[0]*31^(n-1) + s[1]*31^(n-2) + ... + s[n-1]
```

Cost of String operations

> How long does it take to reverse a String?

```
public static String reverse(String s)
{
    String rev = "";
    for (int i = s.length() - 1; i >= 0; i--)
        rev += s.charAt(i);
    return rev;
}
```

Alternative – mutable sequence of characters,
 StringBuilder

```
public static String reverse(String s)
{
    StringBuilder rev = new StringBuilder();
    for (int i = s.length() - 1; i >= 0; i--)
        rev.append(s.charAt(i));
    return rev.toString();
}
```

Substring operation

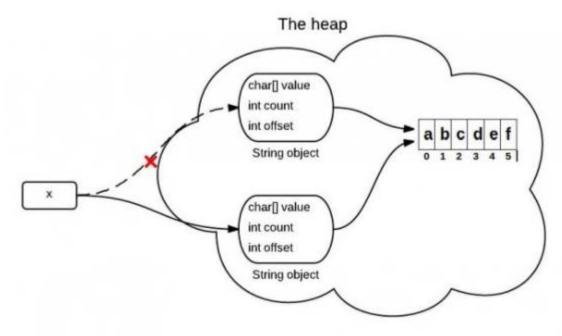
> Java 6 vs Java 7 (and up)

```
String x = "abcdef";
x = x.substring(1,3);
System.out.println(x);
```

https://www.programcreek.com/2013/09/the-substring-method-in-jdk-6-and-jdk-7/

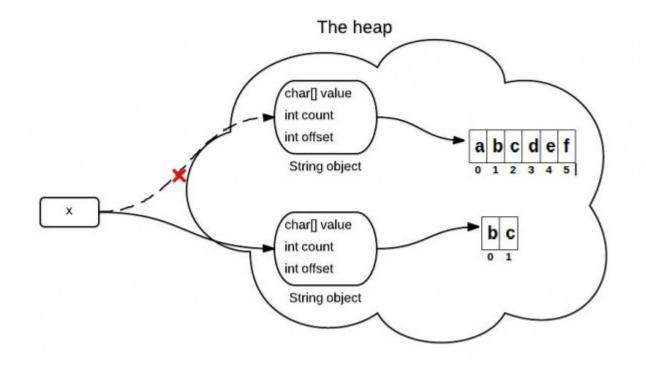
Substring operation in Java 6

- > Cheap (cost of 1)
- > Memory leaks unused portion of the string cant be garbage collected
- > Points to same value
- > Count modified
- > Offset modified



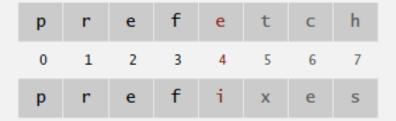
Substring operation in Java 7 (now)

- Cost of N, new string needs to be createdcharacters copied into it
- Old string can be garbage collected



Comparing 2 Strings

Q. How many character compares to compare two strings of length W?



Running time. Proportional to length of longest common prefix.

- Proportional to W in the worst case.
- But, often sublinear in W.

Different Alphabets

 Performance depends on the size of the alphabet (i.e., unique characters) Digital key. Sequence of digits over fixed alphabet. Radix. Number of digits R in alphabet.

name	R()	IgR()	characters
BINARY	2	1	01
OCTAL	8	3	01234567
DECIMAL	10	4	0123456789
HEXADECIMAL	16	4	0123456789ABCDEF
DNA	4	2	ACTG
LOWERCASE	26	5	abcdefghijklmnopqrstuvwxyz
UPPERCASE	26	5	ABCDEFGHIJKLMNOPQRSTUVWXYZ
PROTEIN	20	5	ACDEFGHIKLMNPQRSTVWY
BASE64	64	6	ABCDEFGHIJKLMNOPQRSTUVWXYZabcdef ghijklmnopqrstuvwxyz0123456789+/
ASCII	128	7	ASCII characters
EXTENDED_ASCII	256	8	extended ASCII characters
UNICODE16	65536	16	Unicode characters

Key-Indexed Counting

Review: summary of the performance of sorting algorithms

Frequency of operations.

algorithm	guarantee	random	extra space	stable?	operations on keys
insertion sort	1/2 N ²	¼ N²	1	~	compareTo()
mergesort	Nlg N	$N \lg N$	N	~	compareTo()
quicksort	1.39 N lg N*	1.39 N lg N	$c \lg N$		compareTo()
heapsort	2 N lg N	2 N lg N	1		compareTo()

* probabilistic

Lower bound. $\sim N \lg N$ compares required by any compare-based algorithm.

- Q. Can we do better (despite the lower bound)?
- A. Yes, if we don't depend on key compares. ← to make R-way decisions (Instead of binary decisions)

Key-indexed counting

- > Basis for other more complex sorting algorithms
 - LSD and MSD (least and most significant digit)
- > Specialized sorting algorithm which works best when the following conditions are met:
 - Input consists of collection of *n* items
 - Maximum possible value of each of the individual item is K

Key-indexed counting: assumptions about keys

Assumption. Keys are integers between 0 and R - 1. Implication. Can use key as an array index.

Applications.

- Sort string by first letter.
- Sort class roster by section.
- Sort phone numbers by area code.
- Subroutine in a sorting algorithm. [stay tuned]

Remark. Keys may have associated data ⇒ can't just count up number of keys of each value.

tion	sorted result	
11000	(by section)	
2	Harris	1
3	Martin	1
3	Moore	1
4	Anderson	2
1	Martinez	2
3	Miller	2
4	Robinson	2
3	White	2
1	Brown	3
2	Davis	3
2	Jackson	3
1	Jones	3
2	Taylor	3
4	Williams	3
3	Garcia	4
4	Johnson	4
4	Smith	4
2	Thomas	4
3	Thompson	4
4	Wilson	4
t		
	3 4 3 1 2 2 1 2 4 3 4 4 4 2 3	Martin Moore Anderson Martinez Miller Robinson White Brown Davis Jackson Jones Taylor Williams Garcia Johnson Smith Thomas Thompson Wilson

Goal. Sort an array a[] of N integers between 0 and R - 1.

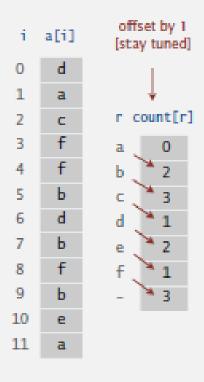
- Count frequencies of each letter using key as index.
- Compute frequency cumulates which specify destinations.
- Access cumulates using key as index to move items.
- Copy back into original array.

```
int N = a.length;
int[] count = new int[R+1];
for (int i = 0; i < N; i++)
   count[a[i]+1]++;
for (int r = 0; r < R; r++)
   count[r+1] += count[r];
for (int i = 0; i < N; i++)
   aux[count[a[i]]++] = a[i];
for (int i = 0; i < N; i++)
   a[i] = aux[i];
```

```
i a[i]
     a 7
                 e for 4
                 f for 5
10
11
```

Goal. Sort an array a[] of N integers between 0 and R-1.

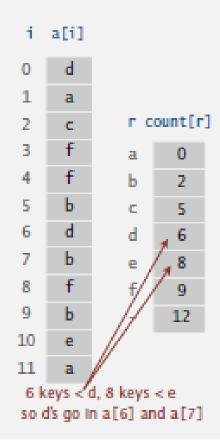
- Count frequencies of each letter using key as index.
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Goal. Sort an array a[] of N integers between 0 and R-1.

- Count frequencies of each letter using key as index.
- Compute frequency cumulates which specify destinations.
- Access cumulates using key as index to move items.
- Copy back into original array.

```
int N = a.length;
            int[] count = new int[R+1];
            for (int i = 0; i < N; i++)
               count[a[i]+1]++;
            for (int r = 0; r < R; r++)
compute
               count[r+1] += count[r];
cumulates
            for (int i = 0; i < N; i++)
               aux[count[a[i]]++] = a[i];
            for (int i = 0; i < N; i++)
               a[i] = aux[i];
```



Goal. Sort an array a[] of N integers between 0 and R-1.

- Count frequencies of each letter using key as index.
- Compute frequency cumulates which specify destinations.
- Access cumulates using key as index to move items.
- Copy back into original array.

i	a[i]				i	aux[i]
0	d				0	a
1	a				1	a
2	C	гс	ount[r]	2	Ь
3	f	a	2		3	Ь
4	f	Ь	5		4	Ь
5	Ь	C	6		5	C
6	d	d	8		6	d
7	Ь	е	9		7	d
8	f	f	12		8	е
9	Ь	_	12		9	f
10	е				10	f
11	a				11	f

Goal. Sort an array a[] of N integers between 0 and R-1.

- Count frequencies of each letter using key as index.
- Compute frequency cumulates which specify destinations.
- Access cumulates using key as index to move items.
- Copy back into original array.

copy back

```
int N = a.length;
int[] count = new int[R+1];

for (int i = 0; i < N; i++)
    count[a[i]+1]++;

for (int r = 0; r < R; r++)
    count[r+1] += count[r];

for (int i = 0; i < N; i++)
    aux[count[a[i]]++] = a[i];

for (int i = 0; i < N; i++)
    aux[i] = aux[i];</pre>
```

i	a[i]			i	aux[i]
0	a			0	a
1	a			1	a
2	Ь	го	ount[r] 2	Ь
3	Ь	a	2	3	Ь
4	Ь	Ь	5	4	Ь
5	C	C	6	5	C
6	d	d	8	6	d
7	d	е	9	7	d
8	e	f	12	8	е
9	f	_	12	9	f
10	f			10	f
11	f			11	f

Key-indexed counting: analysis

Proposition. Key-indexed takes time proportional to N + R.

Proposition. Key-indexed counting uses extra space proportional to N+R.



Radix Sorts - LSD and MSD

Radix sorts

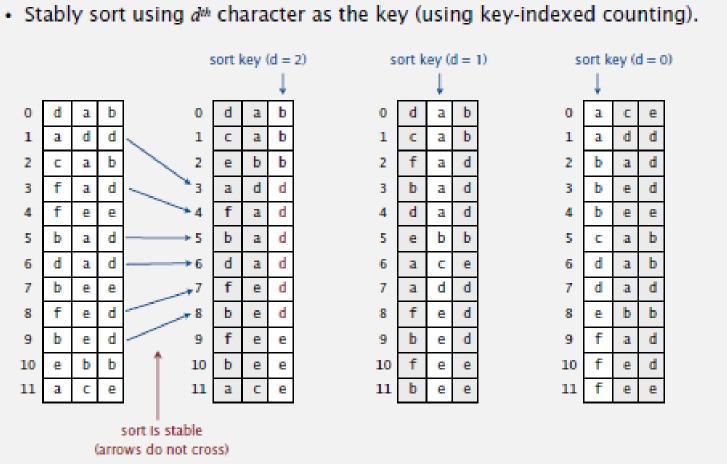
- > Non-comparative integer sorting algorithm
- > Sorts data with integer keys by grouping keys by the individual digits which share the same significant position and value.
- > LSD radix sort
 - short keys come before longer keys
 - keys of the same length are sorted lexicographically
 - le, normal order of integer representations, such as the sequence 1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11
- MSD radix sort
 - lexicographic order, which is suitable for sorting strings, such as words, or fixed-length integer representations
 - A sequence such as "b, c, d, e, f, g, h, i, j, ba" would be lexicographically sorted as "b, ba, c, d, e, f, g, h, i, j"
 - (1 to 10 would be output as 1, 10, 2, 3, 4, 5, 6, 7, 8, 9,)

LSD Sort

LSD Sort - Sort by Least Significant Digit first

LSD string (radix) sort.

- Consider characters from right to left.



LSD exercise

Provide the trace of sorting the array of strings given in a table below using LSD sort, providing an equivalent table for each of the 3 passes of the algorithm.

Α	R	M
С	Α	Т
С	Α	В
Α	R	Т
В	U	G
В	U	S

LSD stability and correctness

LSD string sort: correctness proof

Proposition. LSD sorts fixed-length strings in ascending order.

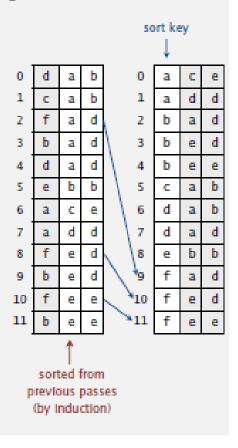
Pf. [by induction on i]

After pass i, strings are sorted by last i characters.

- If two strings differ on sort key, key-indexed sort puts them in proper relative order.
- If two strings agree on sort key, stability keeps them in proper relative order.

Proposition. LSD sort is stable.

Pf. Key-indexed counting is stable.



LSD in Java

```
public class LSD
   public static void sort(String[] a, int W) ← fixed-length w strings
                                                         radix R
      int R = 256;
      int N = a.length;
      String[] aux = new String[N];
                                                          do key-indexed counting
      for (int d = W-1; d >= 0; d--)
                                                          for each digit from right to left
         int[] count = new int[R+1];
         for (int i = 0; i < N; i++)
            count[a[i].charAt(d) + 1]++;
                                                          key-indexed counting
         for (int r = 0; r < R; r++)
            count[r+1] += count[r];
         for (int i = 0; i < N; i++)
            aux[count[a[i].charAt(d)]++] = a[i];
         for (int i = 0; i < N; i++)
            a[i] = aux[i];
```

Performance wrt other sorting algorithms

Frequency of operations.

algorithm	guarantee	random	extra space	stable?	operations on keys
insertion sort	½ N²	¼ N²	1	V	compareTo()
mergesort	Nlg N	$N \lg N$	N	V	compareTo()
quicksort	1.39 Nlg N*	1.39 N lg N	$c \lg N$		compareTo()
heapsort	2 N lg N	2 N lg N	1		compareTo()
LSD sort †	2W(N+R)	$2\;W\left(N+R\right)$	N + R	~	charAt()

^{*} probabilistic

[†] flxed-length W keys

LSD Performance

- > Key indexed counting
 - -11n+4R+1
 - > Initialize arrays n+R+1
 - > First loop 3n
 - > Second loop 3R
 - > Third loop 5n
 - > Fourth loop 2n

> LSD

- -10wn+n+WR
- W x LSD apart from third loop which is just 1 x rather than LSD x
- R usually much smaller than N, so proportional to wn linear!

Example - sorting large integer arrays

String sorting interview question

Problem. Sort one million 32-bit integers.

Ex. Google (or presidential) interview.

Which sorting method to use?

- · Insertion sort.
- Mergesort.
- · Quicksort.
- Heapsort.
- · LSD string sort.

LSD Sorting large integer arrays

- > https://algs4.cs.princeton.edu/51radix/LSD.java.html
- > Break up 32-bit integer in 4 8-bit characters
- > Use bit shifting and masking to isolate characters to sort by

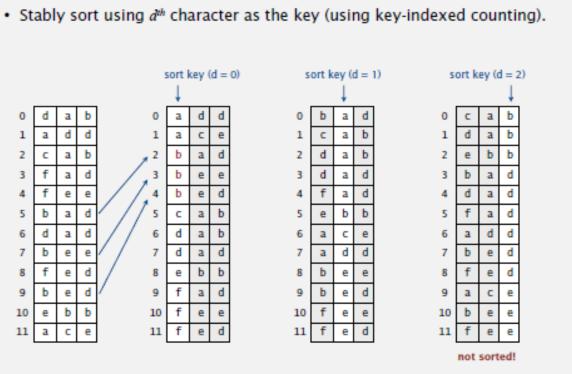
> What if strings are not same length? MSD!

MSD Sort

MSD - Sort by Most Significant Digit first

> Does simply reversing LSD work?

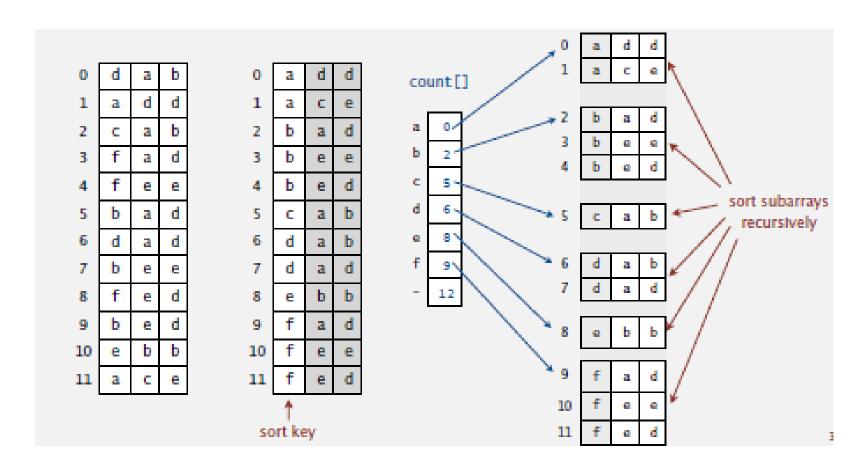
Reverse LSD · Consider characters from left to right.



MSD string sort

- > Similar to quicksort
- Partition array into R (radix) pieces according to the first character (most significant digit) using key-indexed counting
- Recursively sort all strings that start with each character (key-indexed counts delineate subarrays to sort)

MSD String sort



MSD string sort: example

Input		d						
she	aine	ane	аге	are	are	ane	are	аге
sells	by 10.	by	by	by	by	by	by	by
seashells	she >	sells	seashells	Sea	568	sea	5635	56a
by	sells	seashells	sea	seashells	seashells	seashells	seashe Is	seashe s
the	seashells.	sea	seashells	seashells	seashells	seashells	seashells	seashells
sea	503.	sells	sells	sells	sells	sells	sells	sells
shore	shore	seashells	sells	sells	sells	sells .	sells	sells .
the	shells	she	she	she	she	she	she	she
shells	she	shore	shore	shore	shore	shore	shore	shore
she	sells	shells	shells	shells	shells	shells	shore	shells
	surely	she	she	she	she	she	she	she
are	seashells.	surely	surely	surely	surely	surely	surely	surely
surely	the hi	the	the	the	the	the	the	the
seashells	the	the	the	the	the	the	the	the
			need to examin			end o	faring	

		need to examin	Ē		end of goes bej	sring or one	
		in equal keys			, char v		output
are	are	are	are	are	are/	are	are
by	by	by	by	by	by/	by	by
sea	yea .	sea	sea	sea	g/ca	sea.	sea
seashells	seashells	seashells	seashells	seashells,	seashells	seashells	seashells.
seashells	seashells	seashells	seashells	seashell/	seashells	seashells	seashells.
sells	sell s	sells	sells	sells /	sells	sells	sells
sells	sells	sells	sells	sells/	sells	sel1s	sel1s
she	she	she	she	she	she	she	she
shore	sshore	shore	shells	she	she	she	she
shells	hells	shells	she	shells	shells	shells	shells
she	she	she	shore	shore	shore	shore	shore
surely	surely	surely	surely	surely	surely	surely	surely
the	the	the	the	the	the	the	the
the	the	the	the	the	the	the	the

Trace of recursive calls for MSD string sort (no cutoff for small subarrays, subarrays of size 0 and 1 omitted)

Variable length Strings

Treat strings as if they had an extra char at end (smaller than any char).

```
private static int charAt(String s, int d)
{
   if (d < s.length()) return s.charAt(d);
   else return -1;
}</pre>
```

C strings. Have extra char '\0' at end ⇒ no extra work needed.

MSD String sort - Java Implementation

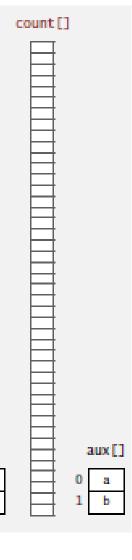
```
public static void sort(String[] a)
   aux = new String[a.length];
                                                       recycles aux[] array
   sort(a, aux, 0, a.length - 1, 0);
                                                      but not count[] array
private static void sort(String[] a, String[] aux, int lo, int hi, int d)
   if (hi <= lo) return;
   int[] count = new int[R+2];
                                                             key-indexed counting
   for (int i = 10; i \le hi; i++)
      count[charAt(a[i], d) + 2]++;
   for (int r = 0; r < R+1; r++)
      count[r+1] += count[r];
   for (int i = lo; i <= hi; i++)
      aux[count[charAt(a[i], d) + 1]++] = a[i];
   for (int i = lo; i <= hi; i++)
      a[i] = aux[i - lo];
                                                        sort R subarrays recursively
   for (int r = 0; r < R; r++)
      sort(a, aux, lo + count[r], lo + count[r+1] - 1, d+1);
```

MSD – improvements

Observation 1. Much too slow for small subarrays.

- · Each function call needs its own count[] array.
- ASCII (256 counts): 100x slower than copy pass for N = 2.
- Unicode (65,536 counts): 32,000x slower for N = 2.

Observation 2. Huge number of small subarrays because of recursion.



a

Yep, you guessed it - cutoff to Insertion sort

Cutoff to insertion sort

Solution. Cutoff to insertion sort for small subarrays.

· Insertion sort, but start at dth character.

```
private static void sort(String[] a, int lo, int hi, int d)
{
   for (int i = lo; i <= hi; i++)
      for (int j = i; j > lo && less(a[j], a[j-1], d); j--)
      exch(a, j, j-1);
}
```

• Implement less() so that it compares starting at dth character.

```
private static boolean less(String v, String w, int d)
{
   for (int i = d; i < Math.min(v.length(), w.length()); i++)
   {
      if (v.charAt(i) < w.charAt(i)) return true;
      if (v.charAt(i) > w.charAt(i)) return false;
   }
   return v.length() < w.length();
}</pre>
```

MSD Performance

Frequency of operations.

algorithm	guarantee	random	extra space	stable?	operations on keys
insertion sort	½ N ²	¼ N²	1	~	compareTo()
mergesort	Nlg N	$N \lg N$	N	V	compareTo()
quicksort	1.39 N lg N*	1.39 N lg N	$c \lg N$		compareTo()
heapsort	2 N lg N	2 N lg N	1		compareTo()
LSD sort †	2 W(N+R)	2 W(N+R)	N + R	V	charAt()
MSD sort *	2W(N+R)	$N \log_R N$	N + D R	V	charAt()
				* D	robabilistic

D = function-call stack depth (length of longest prefix match)

‡ average-length W keys

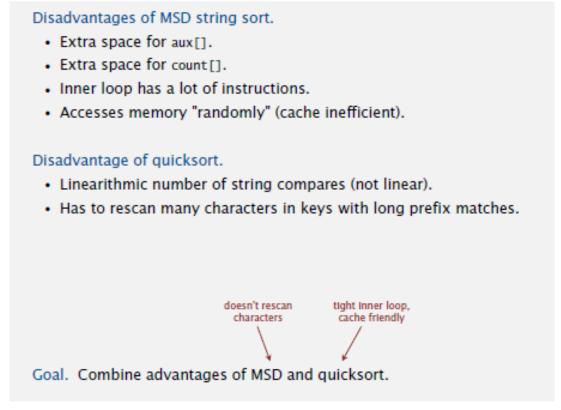
[·] probabilistic

[†] fixed-length W keys

MSD improvements - American flag sort

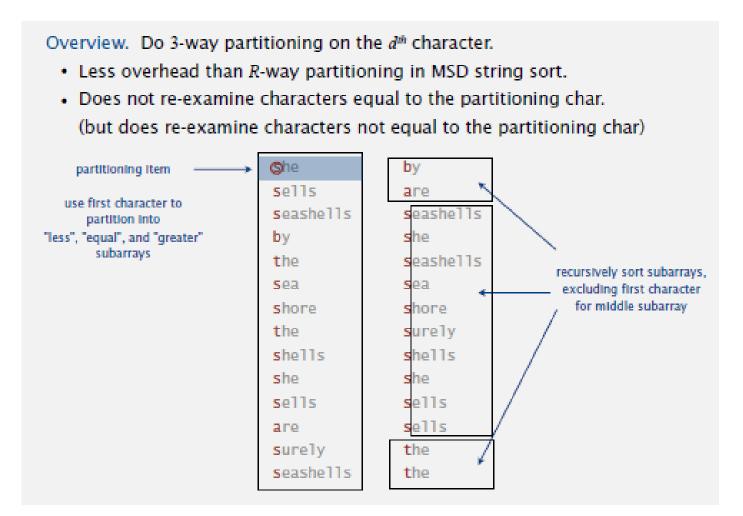
- Analogy to Dutch national flag, partition array into many "stripes"
- In-place variant of radix sort that distributes items into hundreds of buckets
- > How?
- > Cut off to insertion sort
- > Replaces recursion with explicit stack
- > In-place, eliminate auxiliary array (no stability)

MSD vs Quicksort for String sorting

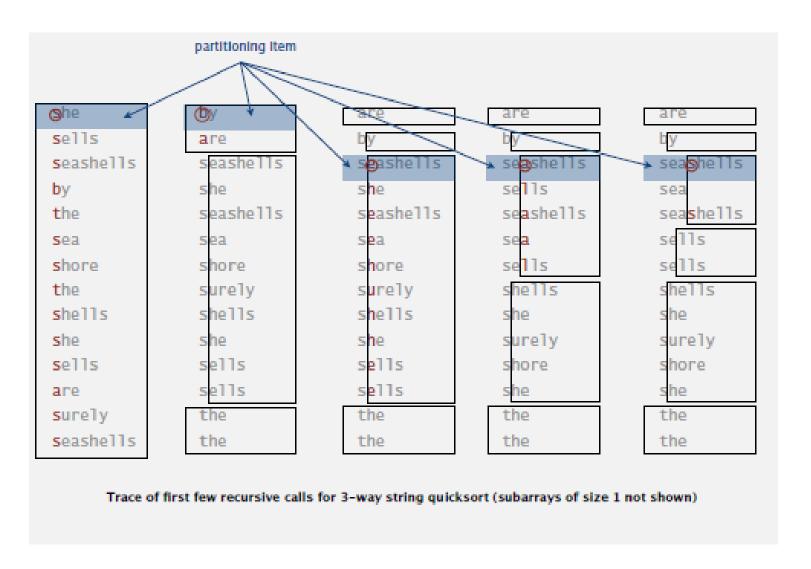


> 3-way string quicksort - addressed inefficiency of both

3-way string quicksort



3- way string quicksort



3-way string quicksort in java

> charAt instead of compare

```
private static void sort(String[] a)
{ sort(a, 0, a.length - 1, 0); }
private static void sort(String[] a, int lo, int hi, int d)
   if (hi <= lo) return;
                                                  3-way partitioning
  int lt = lo, qt = hi;
                                                 (using dth character)
   int v = charAt(a[lo], d); x
   int i = 10 + 1;
   while (i <= qt)
                                         to handle variable-length strings
      int t = charAt(a[i], d);
              (t < v) exch(a, 1t++, i++);
      else if (t > v) exch(a, i, gt--);
                      1++;
      else
   sort(a, lo, lt-1, d);
   if (v >= 0) sort(a, lt, qt, d+1); ← sort 3 subarrays recursively
   sort(a, gt+1, hi, d);
```

Summary of string sorts

Frequency of operations.

algorithm	guarantee	random	extra space	stable?	operations on keys
insertion sort	½ N²	½ N²	1	v	compareTo()
mergesort	$N\lg N$	$N \lg N$	N	V	compareTo()
quicksort	1.39 N1g N*	1.39 N lg N	c lg N		compareTo()
heapsort	2 N lg N	2 N lg N	1		compareTo()
LSD sort †	2 W(N+R)	2W(N+R)	N+R	V	charAt()
MSD sort *	2W(N+R)	$N \log_R N$	N + DR	~	charAt()
3-way string quicksort	1.39 W N lg R*	1.39 N lg N	$\log N + W$		charAt()

String sorting algorithms – when to use which?

- > Insertion
 - Small arrays, arrays in (almost)order
- > Quick
 - General purpose when space is tight
- > Merge
 - General purpose stable
- > 3-way quick
 - Large number of equal keys
- > LSD
 - Short fixed-length strings
- > MSD
 - Random strings
- > 3-way string quicksort
 - General purpose, strings with long pre-fix matches

Check if 2 strings are anagrams

- > two words are anagrams if they contain the same characters
 - "abc" and "cba" are anagrams