

# COMP2521 25T3

## Sorting Algorithms (IV)

### Non-Comparison-Based Sorting Algorithms

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$n \log n$  lower bound  
radix sort

All of the sorting algorithms so far have been  
**comparison-based** sorts.

It can be shown that these algorithms require  $\Omega(n \log n)$  comparisons.  
That is, they require at least  $kn \log n$  comparisons for some constant  $k$ .

Why?

Suppose we need to sort 3 items.



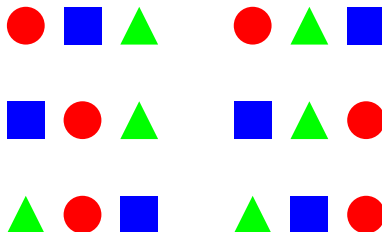
Obviously, one comparison is not sufficient to sort them.

Suppose we need to sort 3 items.



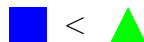
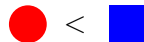
Even two comparisons are not sufficient to sort them. Why?

If we have 3 items, there are  $3! = 6$  ways to order them:



Assuming items are unique, one of these permutations is in sorted order.























Suppose we performed the following comparisons:



Four combinations of results are possible:

(true, true), (true, false), (false, true), (false, false)

The two comparisons create four groups, and each permutation of items belongs to one of these groups

 < 	true	true	false	false
 < 	true	false	true	false
	  	     	     	  

Mathematically,

If we have 3 items, then there are  $3! = 6$  ways to order them.

In other words, 6 possible permutations.

But if we only perform 2 comparisons, then there are only  $2^2 = 4$  groups, so at least one group will contain more than one permutation.

We need at least 3 comparisons, because this creates  $2^3 = 8$  groups, so each permutation can belong in its own group.



If we have  $n$  items, then there are  $n!$  permutations.

If we perform  $k$  comparisons, that creates up to  $2^k$  groups.

So given  $n$  items, we must perform enough comparisons  $k$  such that

$$2^k \geq n!$$

So given  $n$  items, we must perform enough comparisons  $k$  such that

$$2^k \geq n!$$

Taking the  $\log_2$  of both sides gives

$$\log_2 2^k \geq \log_2 n!$$

Since  $\log_2 2^k = k$ , we get

$$k \geq \log_2 n!$$

Using Stirling's approximation, we get

$$k \geq n \log_2 n - n \log_2 e + O(\log_2 n)$$

Removing lower-order terms gives

$$k = \Omega(n \log_2 n)$$

Therefore:

The theoretical lower bound on  
worst-case execution time  
for comparison-based sorts is  $\Omega(n \log n)$ .

If we aren't limited to just comparing keys,  
we can achieve better than  $O(n \log n)$  worst-case time.

**Non-comparison-based** sorting algorithms exploit specific properties  
of the data to sort it.

Radix sort is a non-comparison-based sorting algorithm.

It requires us to be able to decompose our keys into individual symbols (digits, characters, bits, etc.), for example:

- The key 372 is decomposed into (3, 7, 2)
- The key “sydney” is decomposed into ('s', 'y', 'd', 'n', 'e', 'y')

Formally, each key  $k$  is decomposed into a tuple  $(k_1, k_2, k_3, \dots, k_m)$ .

Ideally, the range of possible symbols is reasonably small, for example:

- Numeric: 0-9
- Alphabetic: a-z

The number of possible symbols is known as the **radix**, and is denoted by  $R$ .

- Numeric:  $R = 10$  (for base 10)
- Alphabetic:  $R = 26$

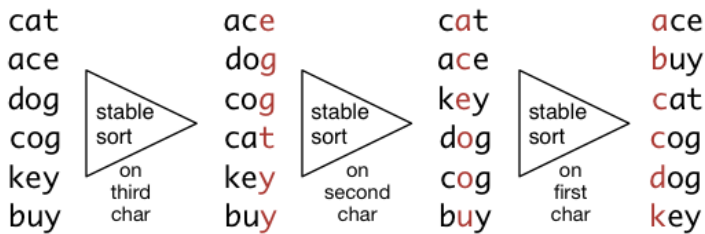
If the keys have different lengths, pad them with a suitable symbol, for example:

- Numeric: 123, 015, 007
- Alphabetic: "abc", "zz\_", "t\_\_"

## Method:

- Perform stable sort on  $k_m$
- Perform stable sort on  $k_{m-1}$
- ...
- Perform stable sort on  $k_1$

## Example:



```
radixSort(A):
```

```
    Input: array A of keys where  
           each key consists of m symbols from an "alphabet"
```

```
    initialise R buckets // one for each symbol
```

```
    for i from m down to 1:
```

```
        empty all buckets
```

```
        for each key in A:
```

```
            append key to bucket key[i]
```

```
    clear A
```

```
    for each bucket (in order):
```

```
        for each key in bucket:
```

```
            append key to A
```



Assume alphabet is  $\{ 'a', 'b', 'c' \}$ , so  $R = 3$ .

We want to sort the array:

$[ "abc", "cab", "baa", "a", "ca" ]$

First, pad keys with blank characters:

$[ "abc", "cab", "baa", "a_{\square\square}", "ca_{\square}" ]$

Each key contains three characters, so  $m = 3$ .

$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

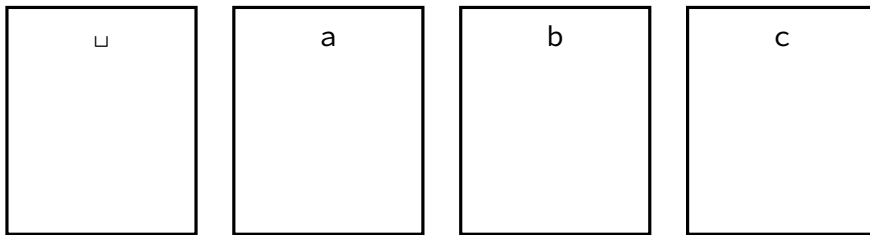
Analysis

Properties

Array:

"abc"	"cab"	"baa"	"a <sub>  </sub> "	"ca <sub> </sub> "
-------	-------	-------	--------------------	--------------------

Buckets:



$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

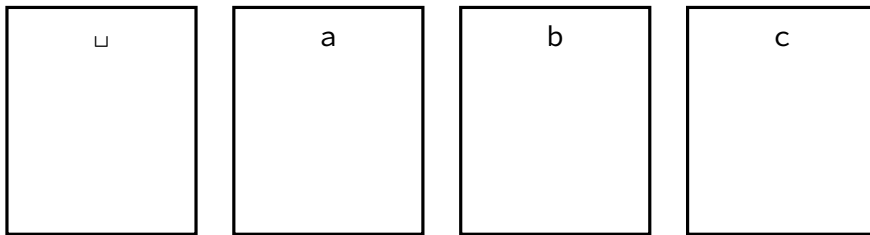
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Radix Sort

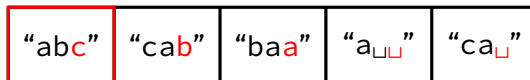
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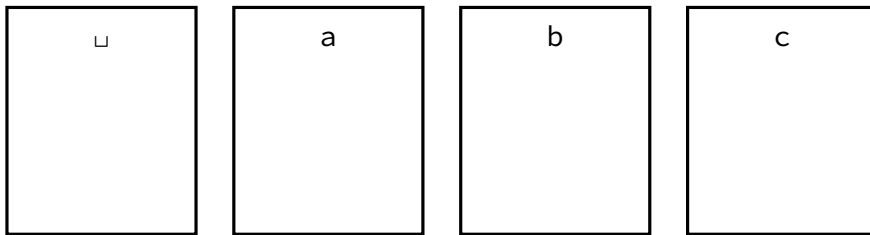
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Properties

Array:



Buckets:



$n \log n$  Lower  
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Radix Sort

Pseudocode

Example

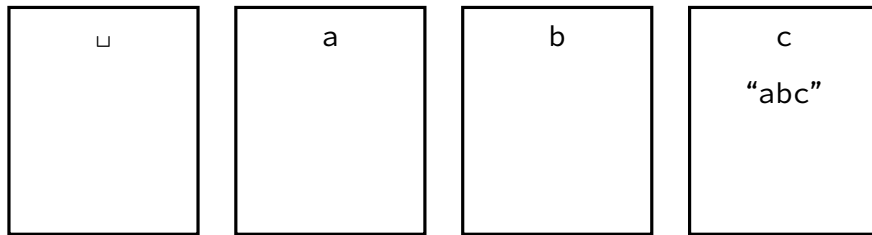
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Buckets:



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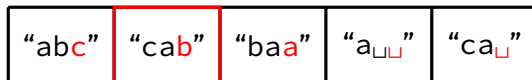
Pseudocode

Example

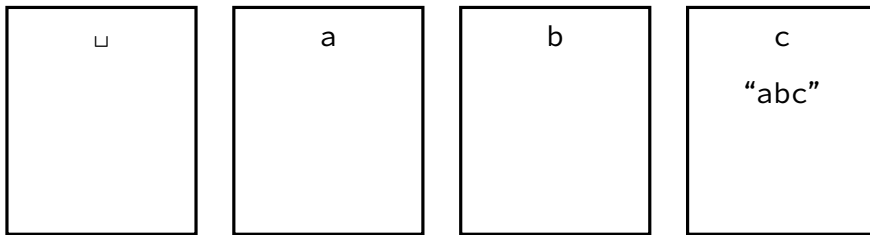
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Buckets:



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Radix Sort

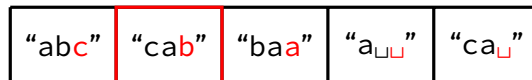
Pseudocode

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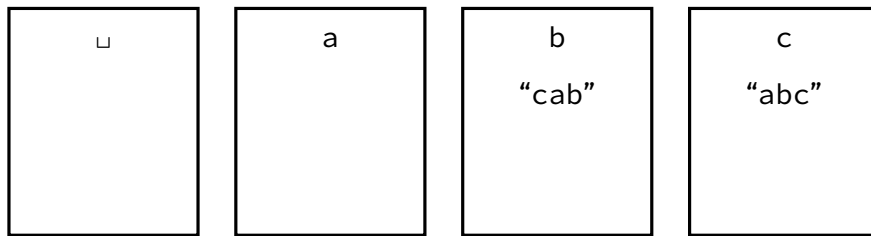
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Radix Sort

Pseudocode

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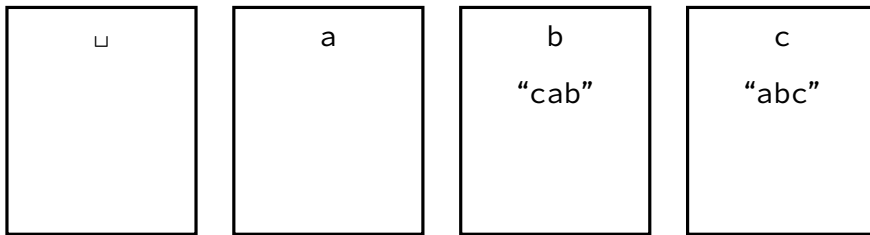
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Buckets:





$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

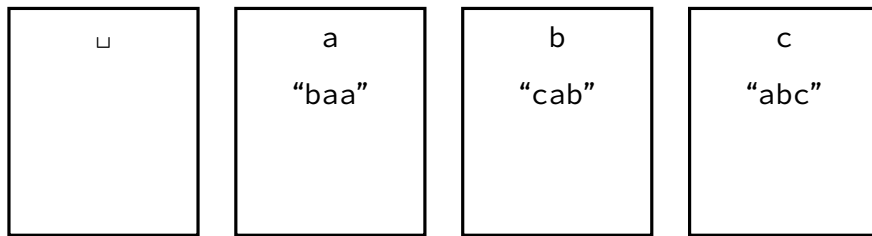
Analysis

Properties

Array:

"abc"	"cab"	"baa"	"a□□"	"ca□"
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Buckets:



$n \log n$  Lower  
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Radix Sort

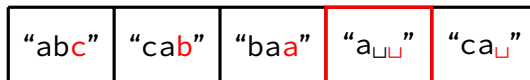
Pseudocode

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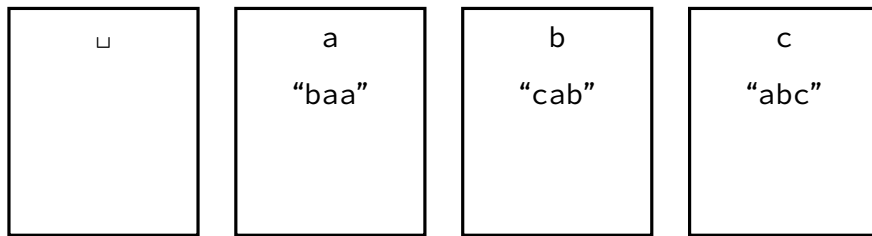
Analysis

Properties

Array:



Buckets:



$n \log n$  Lower  
Bound

Radix Sort

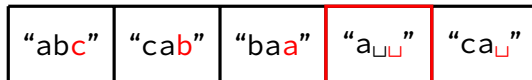
Pseudocode

Example

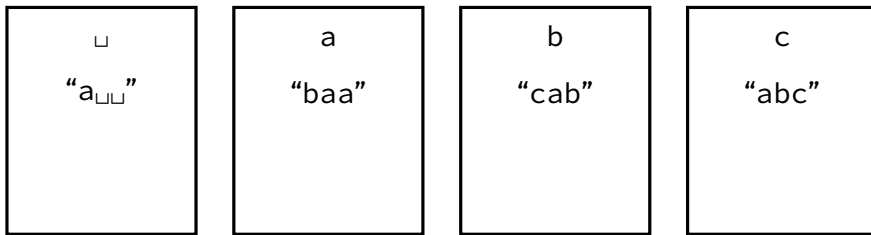
Analysis

Properties

Array:



Buckets:



$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

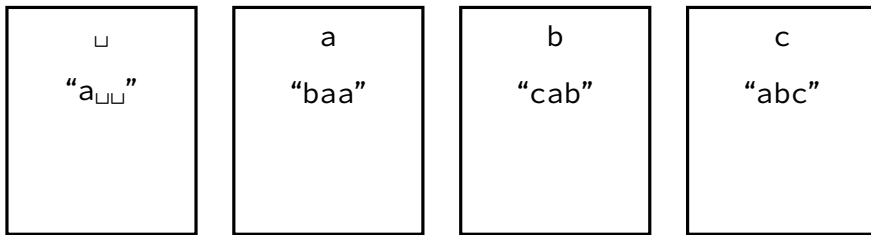
Analysis

Properties

Array:

"abc"	"cab"	"baa"	"a__"	"ca_"
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Buckets:



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Radix Sort

Pseudocode

Example

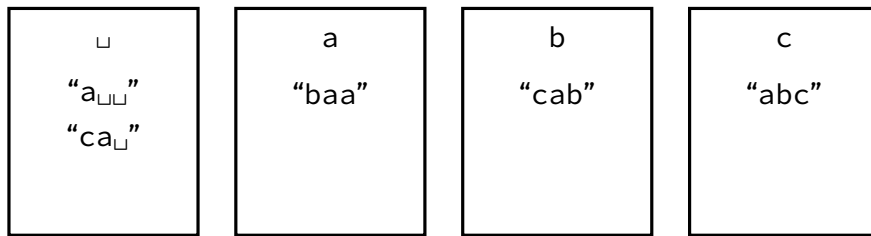
Analysis

Properties

Array:

"abc"	"cab"	"baa"	"a□□"	"ca□"
-------	-------	-------	-------	-------

Buckets:



$n \log n$  Lower  
Bound

Radix Sort

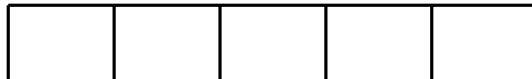
Pseudocode

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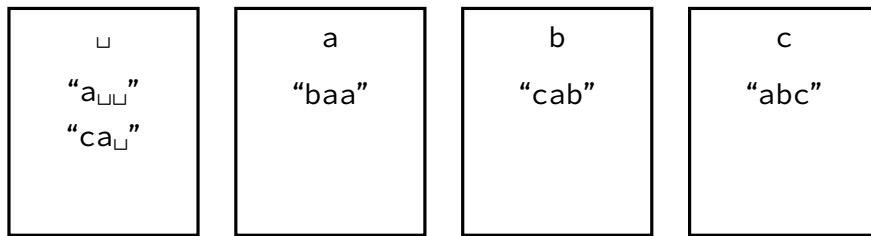
Analysis

Properties

Array:



Buckets:



$n \log n$  Lower  
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Radix Sort

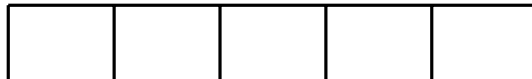
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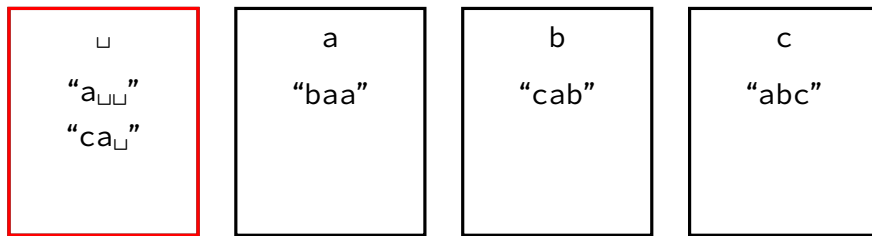
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Properties

Array:



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Bound

Radix Sort

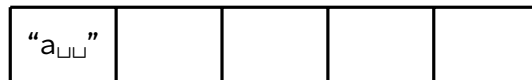
Pseudocode

Example

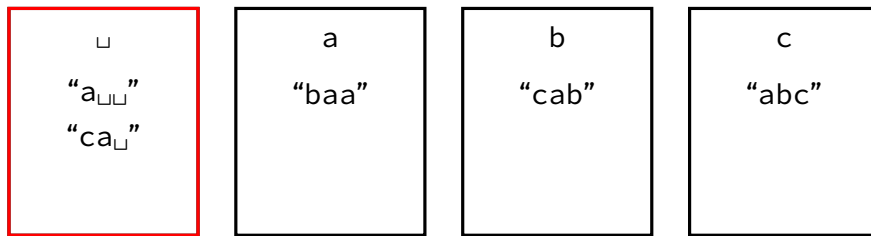
Analysis

Properties

Array:



Buckets:





$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

Analysis

Properties

Array:

"a <sub>  </sub> "	"ca <sub> </sub> "			
--------------------	--------------------	--	--	--

Buckets:

<div> </div> <div>"a<sub>  </sub>"</div> <div>"ca<sub> </sub>"</div>	<div>a</div> <div>"baa"</div>	<div>b</div> <div>"cab"</div>	<div>c</div> <div>"abc"</div>
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$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

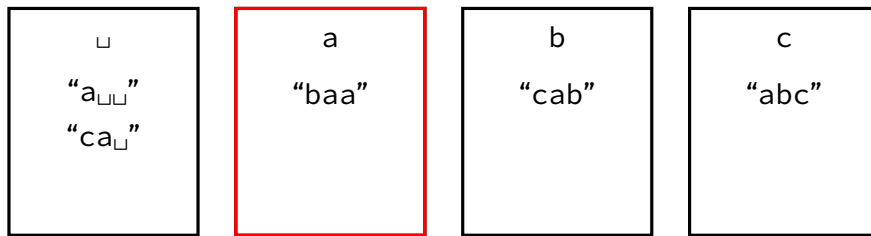
Analysis

Properties

Array:

"a <sub>  </sub> "	"ca <sub> </sub> "			
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Buckets:



$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

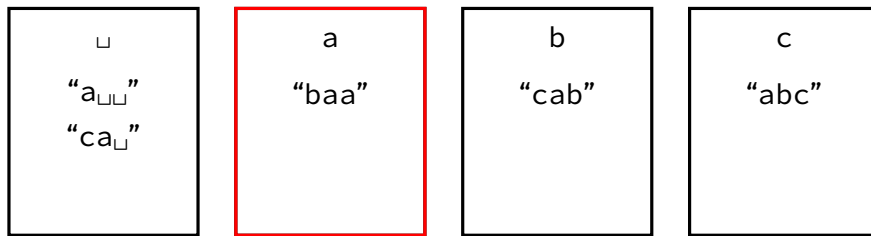
Analysis

Properties

Array:

"a <sub>  </sub> "	"ca <sub> </sub> "	"baa"		
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Buckets:



$n \log n$  Lower  
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Radix Sort

Pseudocode

Example

Analysis

Properties

Array:

"a <sub>  </sub> "	"ca <sub> </sub> "	"baa"		
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Buckets:

<div> </div> <div>"a<sub>  </sub>"</div> <div>"ca<sub> </sub>"</div>	<div>a</div> <div>"baa"</div>	<div>b</div> <div>"cab"</div>	<div>c</div> <div>"abc"</div>
--	-------------------------------	-------------------------------	-------------------------------

$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

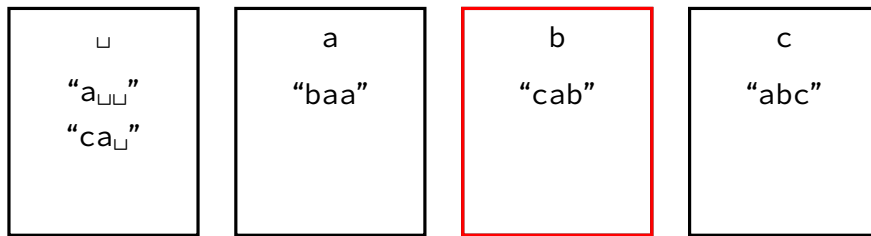
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"a <sub>  </sub> "	"ca <sub> </sub> "	"baa"	"cab"	
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Buckets:



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Radix Sort

Pseudocode

Example

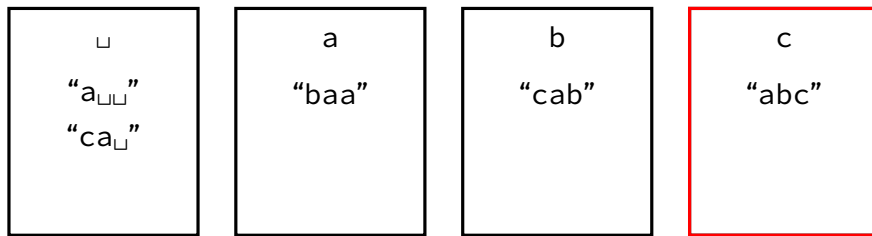
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"a <sub>  </sub> "	"ca <sub> </sub> "	"baa"	"cab"	
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Radix Sort

Pseudocode

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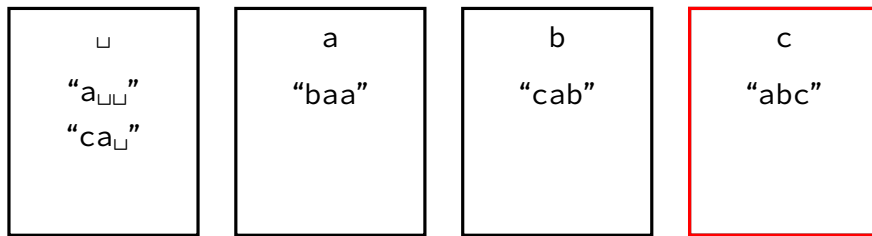
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"a <sub>  </sub> "	"ca <sub> </sub> "	"baa"	"cab"	"abc"
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Radix Sort

Pseudocode

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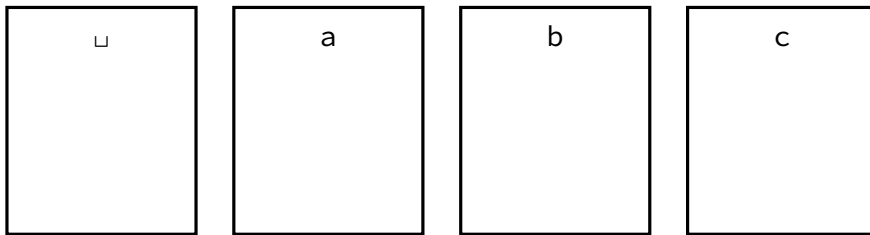
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Radix Sort

Pseudocode

Example

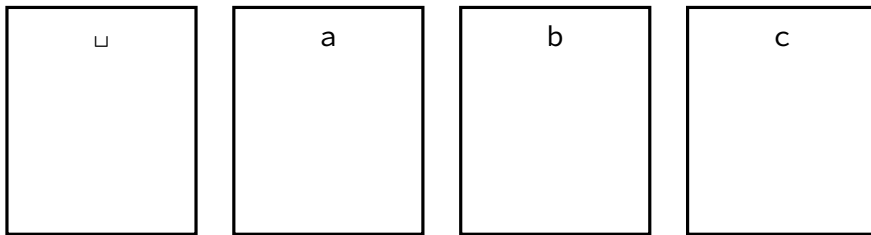
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Pseudocode

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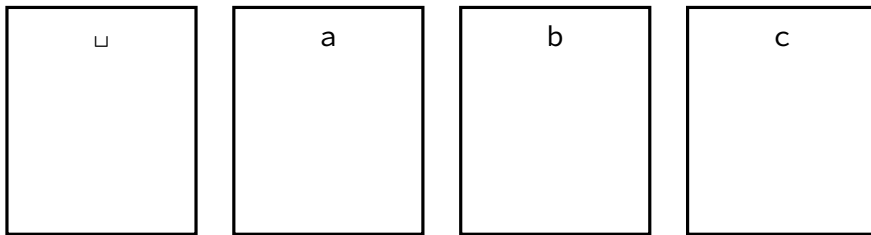
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Buckets:



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Radix Sort

Pseudocode

Example

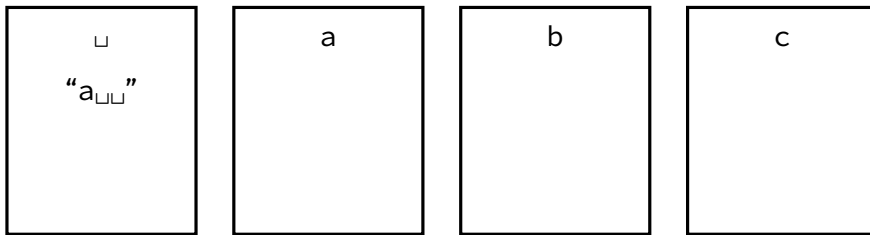
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Radix Sort

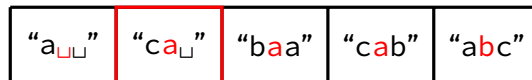
Pseudocode

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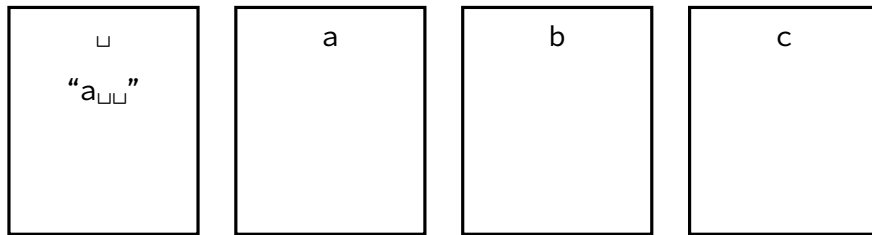
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Radix Sort

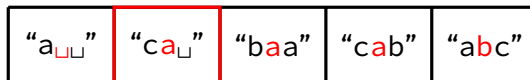
Pseudocode

Example

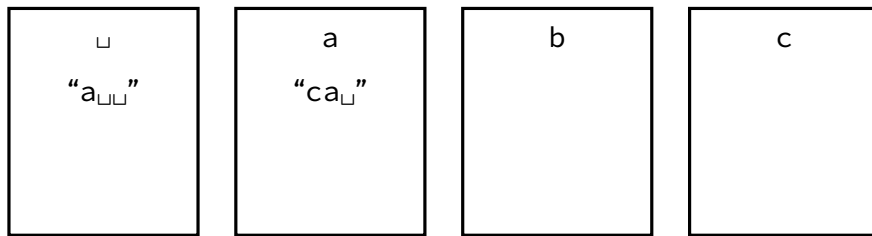
Analysis

Properties

Array:



Buckets:



$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

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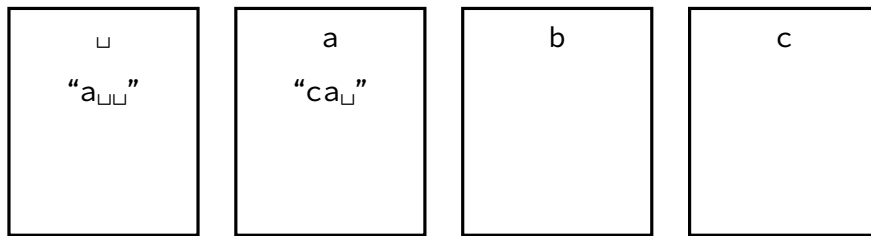
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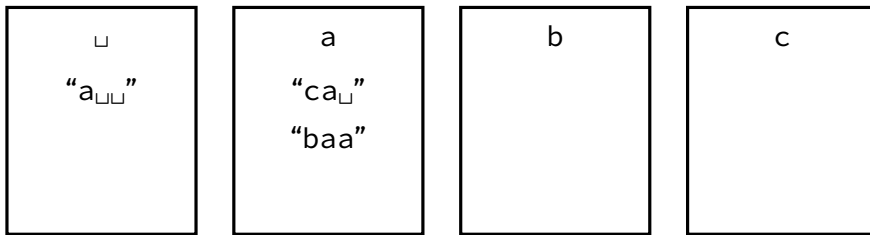
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Radix Sort

Pseudocode

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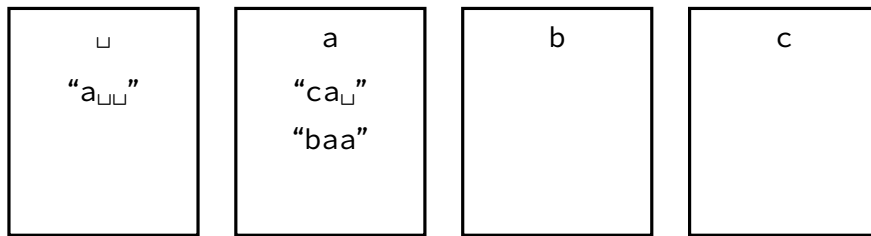
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Buckets:





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Radix Sort

Pseudocode

Example

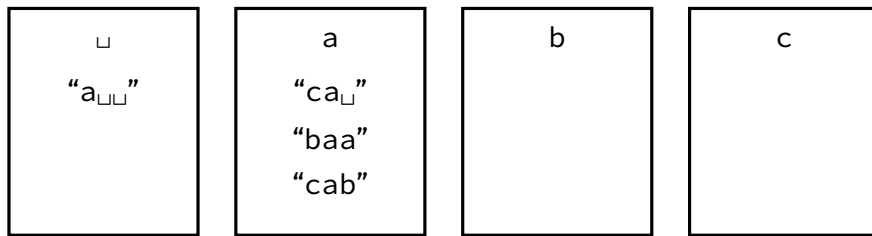
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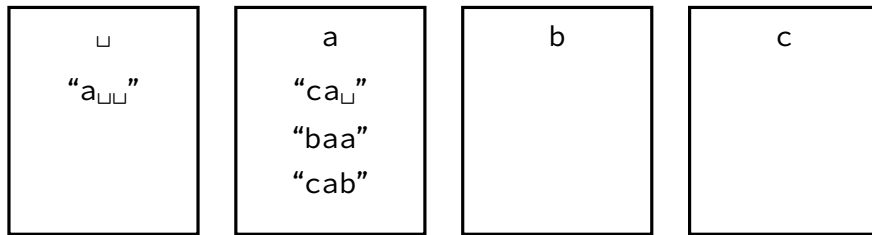
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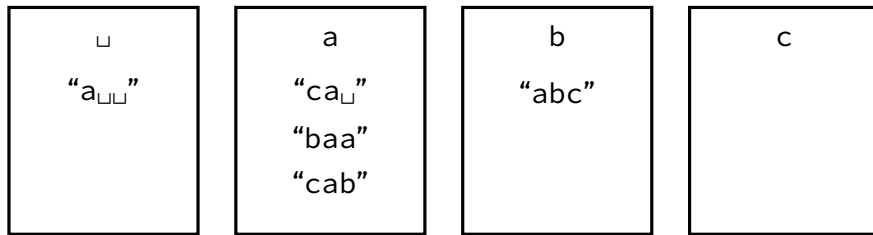
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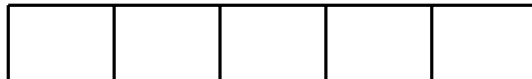
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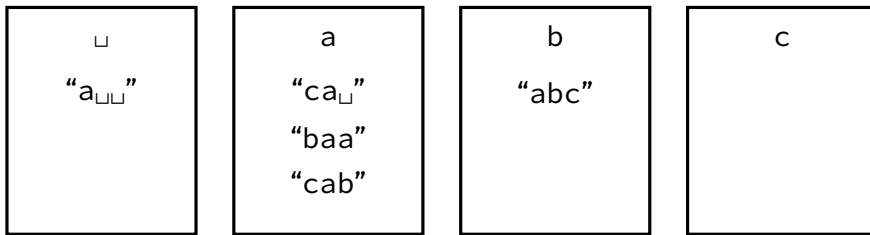
Analysis

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Array:



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$n \log n$  Lower  
Bound

Radix Sort

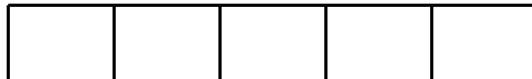
Pseudocode

Example

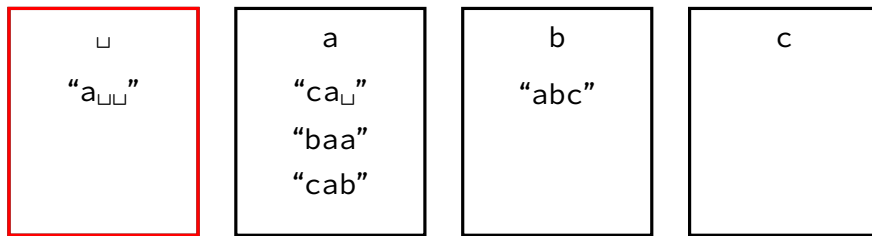
Analysis

Properties

Array:



Buckets:



$n \log n$  Lower  
Bound

Radix Sort

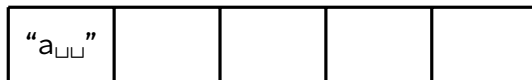
Pseudocode

Example

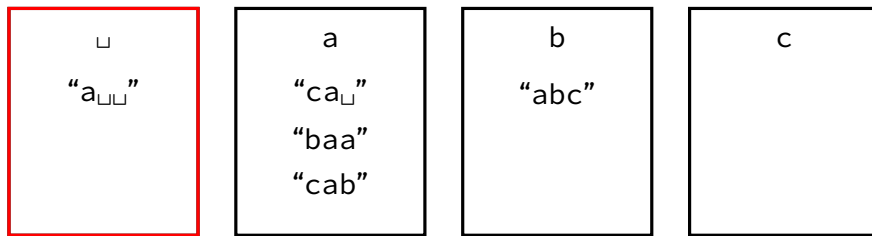
Analysis

Properties

Array:



Buckets:



$n \log n$  Lower  
Bound

Radix Sort

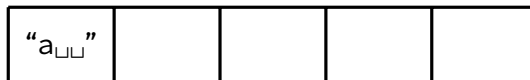
Pseudocode

Example

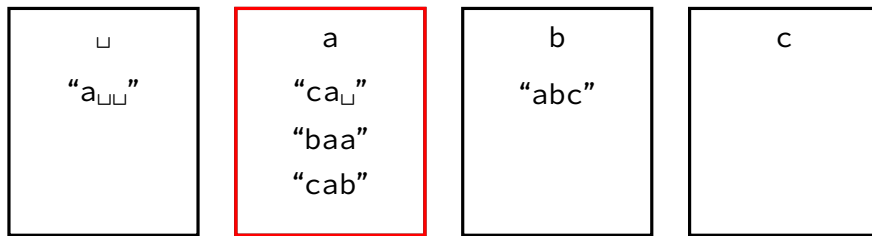
Analysis

Properties

Array:



Buckets:



$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

Analysis

Properties

Array:

"a <sub>  </sub> "	"ca <sub> </sub> "			
--------------------	--------------------	--	--	--

Buckets:

<div> </div> <div>"a<sub>  </sub>"</div>	<div>a</div> <div>"ca<sub> </sub>"</div> <div>"baa"</div> <div>"cab"</div>	<div>b</div> <div>"abc"</div>	<div>c</div>
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$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

Analysis

Properties

Array:

"a <sub>  </sub> "	"ca <sub> </sub> "	"baa"		
--------------------	--------------------	-------	--	--

Buckets:

<div> </div> <div>"a<sub>  </sub>"</div>	<div>a</div> <div>"ca<sub> </sub>"</div> <div>"baa"</div> <div>"cab"</div>	<div>b</div> <div>"abc"</div>	<div>c</div>
--	--	-------------------------------	--------------

$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

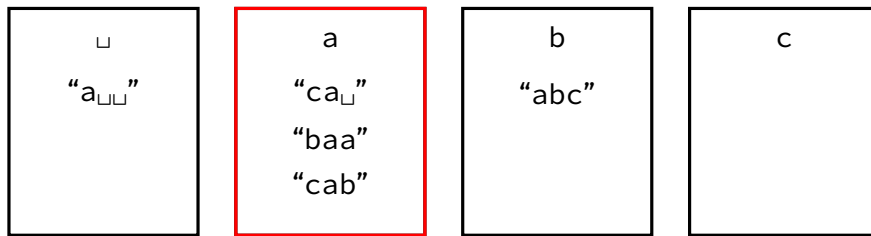
Analysis

Properties

Array:

"a <sub>  </sub> "	"ca <sub> </sub> "	"baa"	"cab"	
--------------------	--------------------	-------	-------	--

Buckets:



$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

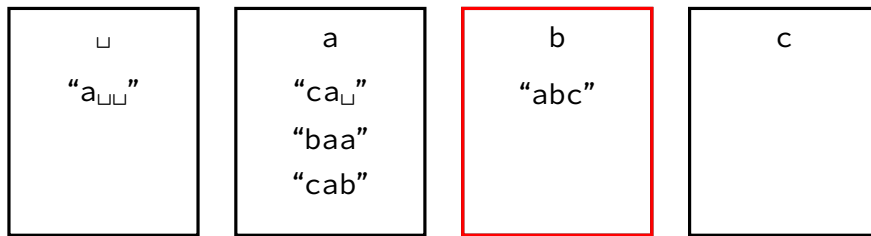
Analysis

Properties

Array:

"a <sub>  </sub> "	"ca <sub> </sub> "	"baa"	"cab"	
--------------------	--------------------	-------	-------	--

Buckets:



$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

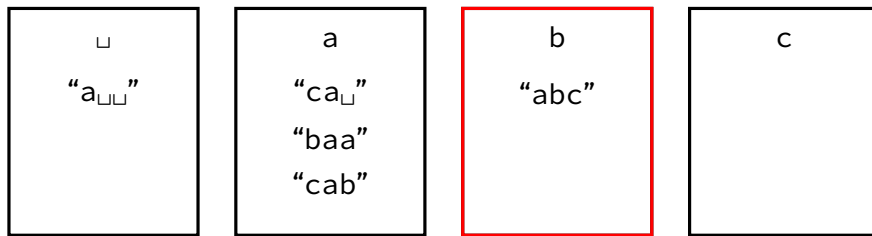
Analysis

Properties

Array:

"a <sub>  </sub> "	"ca <sub> </sub> "	"baa"	"cab"	"abc"
--------------------	--------------------	-------	-------	-------

Buckets:



$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

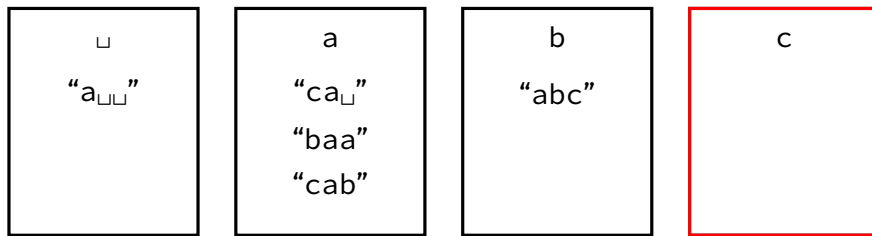
Analysis

Properties

Array:

"a <sub>  </sub> "	"ca <sub> </sub> "	"baa"	"cab"	"abc"
--------------------	--------------------	-------	-------	-------

Buckets:



$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

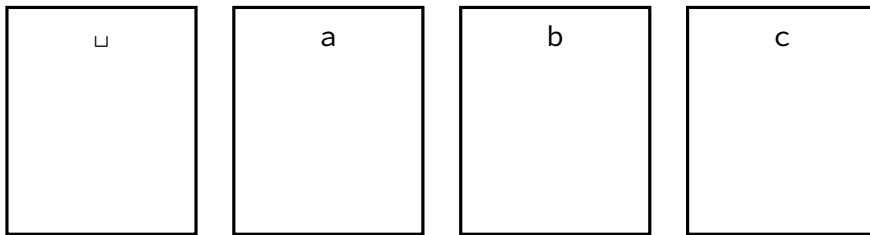
Analysis

Properties

Array:

"a <sub>  </sub> "	"ca <sub> </sub> "	"baa"	"cab"	"abc"
--------------------	--------------------	-------	-------	-------

Buckets:



$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

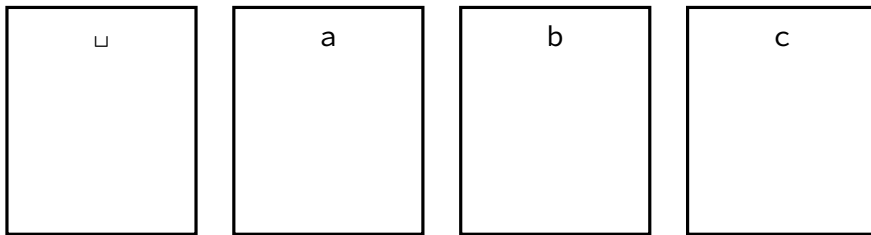
Analysis

Properties

Array:

"a <sub>  </sub> "	"ca <sub> </sub> "	"baa"	"cab"	"abc"
--------------------	--------------------	-------	-------	-------

Buckets:



$n \log n$  Lower  
Bound

Radix Sort

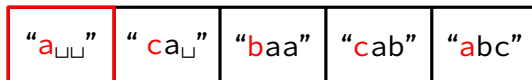
Pseudocode

Example

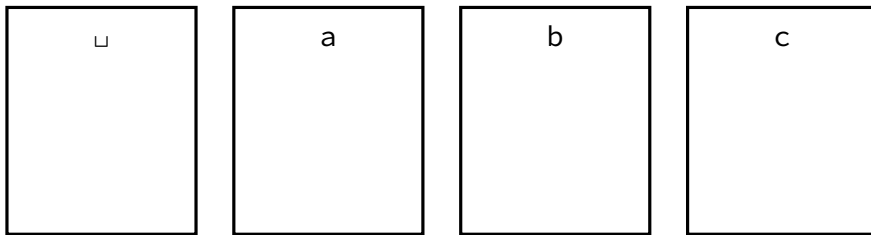
Analysis

Properties

Array:



Buckets:





$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

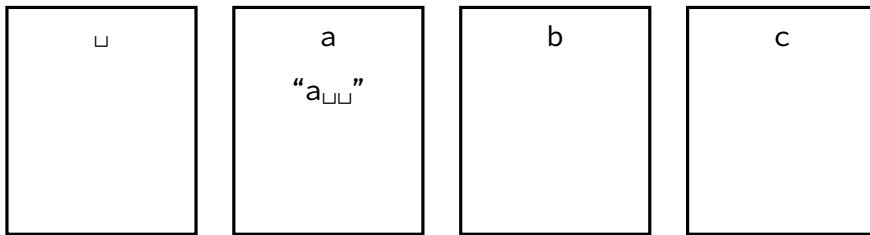
Analysis

Properties

Array:

"a <sub>  </sub> "	"c a <sub> </sub> "	"b a a"	"c a b"	"a b c"
--------------------	---------------------	---------	---------	---------

Buckets:



$n \log n$  Lower  
Bound

Radix Sort

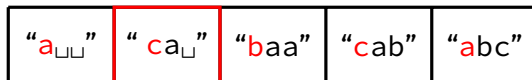
Pseudocode

Example

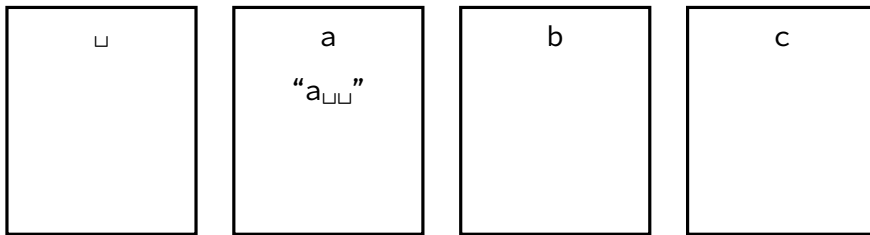
Analysis

Properties

Array:



Buckets:



"a <sub>□□</sub> "	"ca <sub>□</sub> "	"baa"	"cab"	"abc"
--------------------	--------------------	-------	-------	-------

Diagram illustrating the construction of a sequence of strings:

- Box a: Contains the string  $a$  and the string  $a_{\square\square}$ .
- Box b: Contains the string  $b$ .
- Box c: Contains the string  $c$  and the string  $ca_{\square}$ .
- Box d: Is empty.

$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

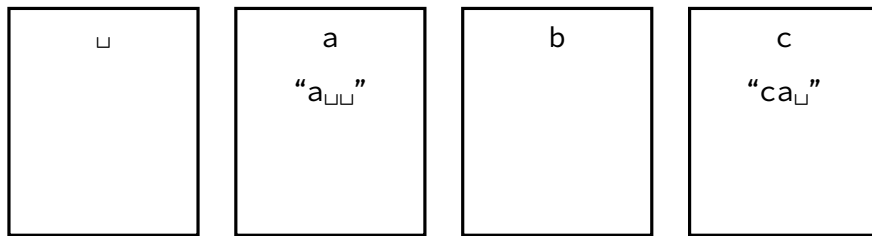
Analysis

Properties

Array:

"a <sub>  </sub> "	"ca <sub> </sub> "	"baa"	"cab"	"abc"
--------------------	--------------------	-------	-------	-------

Buckets:



$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

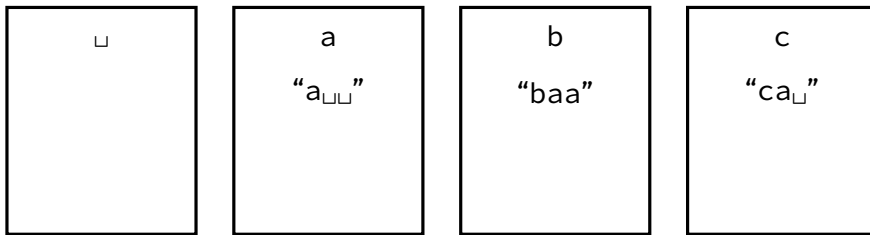
Analysis

Properties

Array:

"a <sub>  </sub> "	"ca <sub> </sub> "	"baa"	"cab"	"abc"
--------------------	--------------------	-------	-------	-------

Buckets:



$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

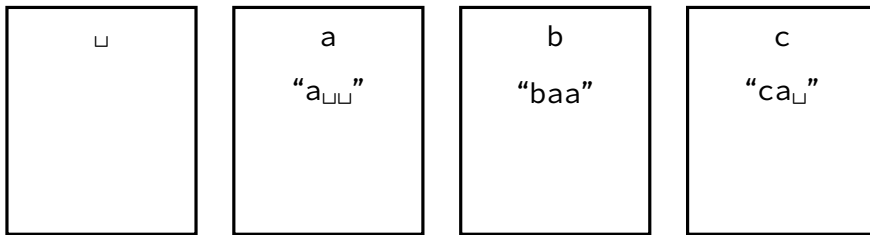
Analysis

Properties

Array:

"a <sub>  </sub> "	"c a <sub> </sub> "	"baa"	"cab"	"abc"
--------------------	---------------------	-------	-------	-------

Buckets:



$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

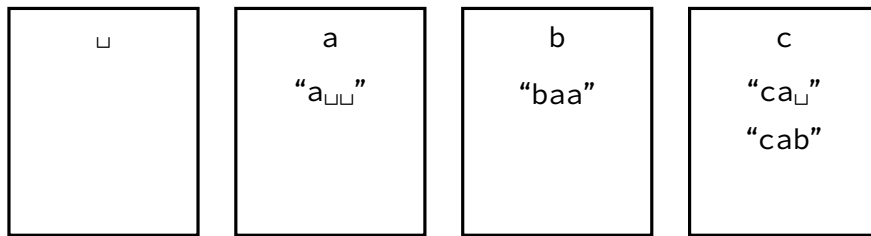
Analysis

Properties

Array:

"a <sub>  </sub> "	"ca <sub> </sub> "	"baa"	"cab"	"abc"
--------------------	--------------------	-------	-------	-------

Buckets:



$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

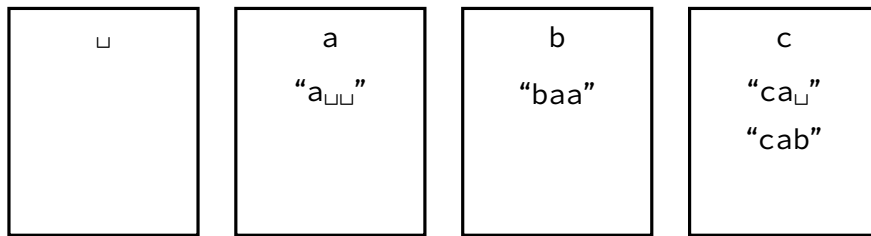
Analysis

Properties

Array:

"a <sub>  </sub> "	"c a <sub> </sub> "	"baa"	"cab"	"abc"
--------------------	---------------------	-------	-------	-------

Buckets:





$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

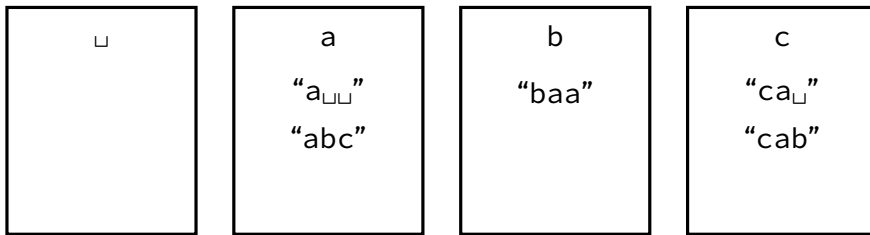
Analysis

Properties

Array:

"a <sub>  </sub> "	"ca <sub> </sub> "	"baa"	"cab"	"abc"
--------------------	--------------------	-------	-------	-------

Buckets:



$n \log n$  Lower  
Bound

Radix Sort

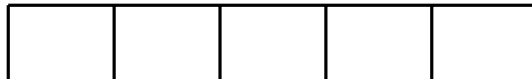
Pseudocode

Example

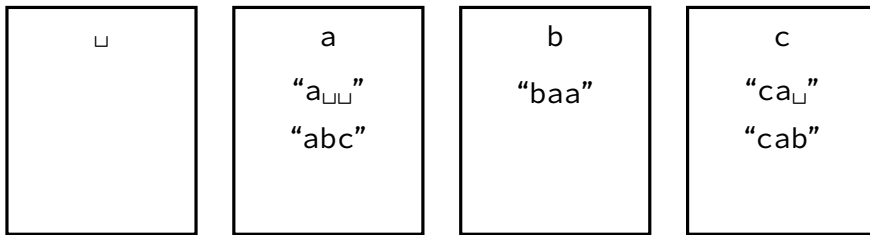
Analysis

Properties

Array:



Buckets:



$n \log n$  Lower  
Bound

Radix Sort

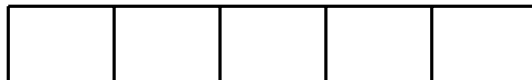
Pseudocode

Example

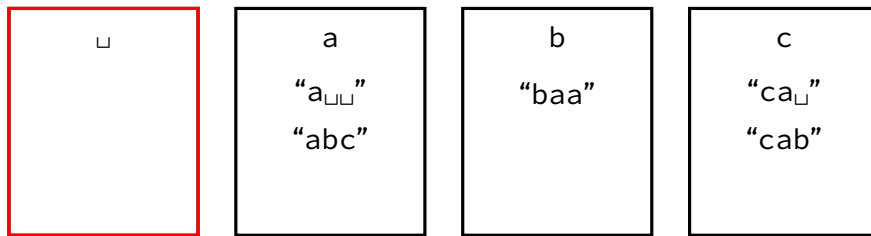
Analysis

Properties

Array:



Buckets:



$n \log n$  Lower  
Bound

Radix Sort

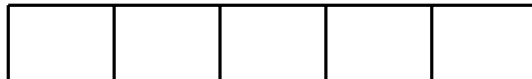
Pseudocode

Example

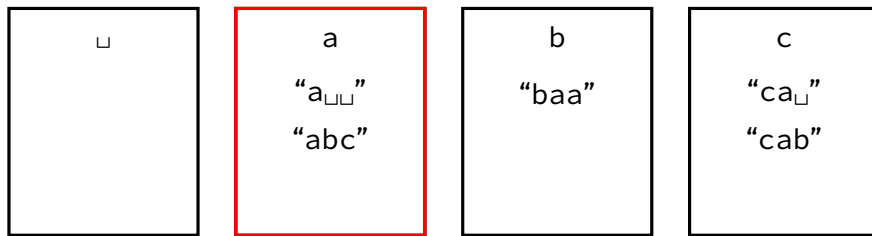
Analysis

Properties

Array:



Buckets:



$n \log n$  Lower  
Bound

Radix Sort

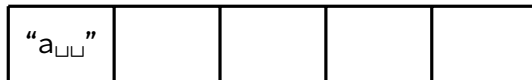
Pseudocode

Example

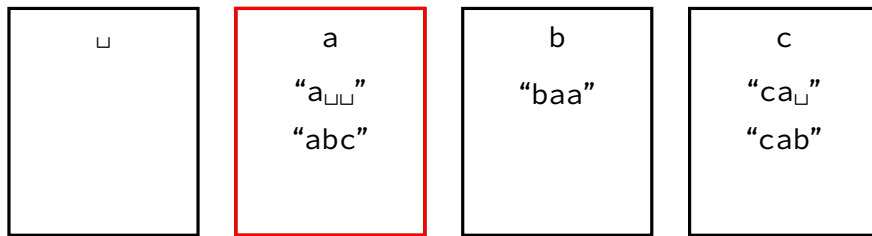
Analysis

Properties

Array:



Buckets:



$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

Analysis

Properties

Array:

"a <sub>  </sub> "	"abc"			
--------------------	-------	--	--	--

Buckets:

<div> </div>	<div>a "a<sub>  </sub>" "abc"</div>	<div>b "baa"</div>	<div>c "ca<sub>  </sub>" "cab"</div>
--------------	---	------------------------	--

$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

Analysis

Properties

Array:

"a <sub>  </sub> "	"abc"			
--------------------	-------	--	--	--

Buckets:

<div> </div>	<div>a</div> <div>"a<sub>  </sub>"</div> <div>"abc"</div>	<div>b</div> <div>"baa"</div>	<div>c</div> <div>"ca<sub>  </sub>"</div> <div>"cab"</div>
--------------	---	-------------------------------	--

$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

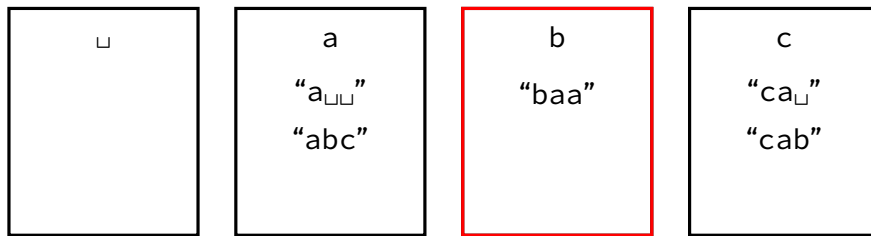
Analysis

Properties

Array:

"a <sub>111</sub> "	"abc"	"baa"		
---------------------	-------	-------	--	--

Buckets:





$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

Analysis

Properties

Array:

"a <sub>111</sub> "	"abc"	"baa"		
---------------------	-------	-------	--	--

Buckets:

   □	a "a <sub>111</sub> " "abc"	b "baa"	c "ca <sub>1</sub> " "cab"
---------------	-----------------------------------	------------	----------------------------------

$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

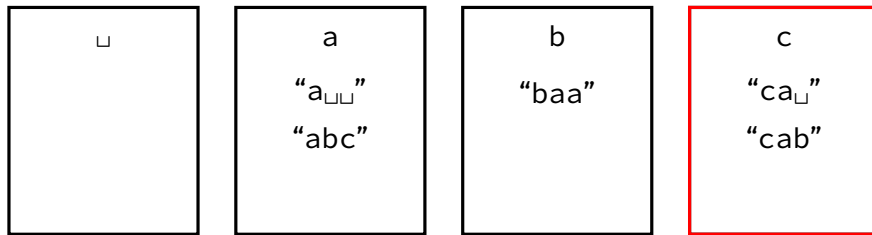
Analysis

Properties

Array:

"a <sub>  </sub> "	"abc"	"baa"	"ca <sub> </sub> "	
--------------------	-------	-------	--------------------	--

Buckets:



$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

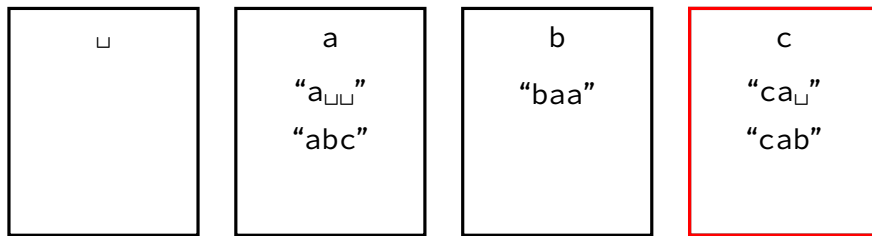
Analysis

Properties

Array:

"a <sub>  </sub> "	"abc"	"baa"	"ca <sub> </sub> "	"cab"
--------------------	-------	-------	--------------------	-------

Buckets:



$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

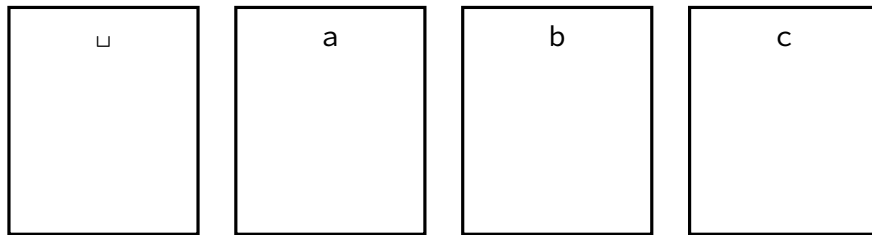
Analysis

Properties

Array:

"a□□"	"abc"	"baa"	"ca□"	"cab"
-------	-------	-------	-------	-------

Buckets:



## Analysis:

- Array contains  $n$  keys
- Each key contains  $m$  symbols
- Radix sort uses  $R$  buckets
- A single stable sort runs in time  $O(n + R)$
- Radix sort uses stable sort  $m$  times

Hence, time complexity for radix sort is  $O(m(n + R))$ .

- $\approx O(mn)$ , assuming  $R$  is small

Therefore, radix sort performs better than comparison-based sorting algorithms:

- When keys are short (i.e.,  $m$  is small) and arrays are large (i.e.,  $n$  is large)

## **Stable**

All sub-sorts performed are stable

## **Non-adaptive**

Same steps performed, regardless of sortedness

## **Not in-place**

Uses  $O(R + n)$  additional space for buckets  
and storing keys in buckets

$n \log n$  Lower  
Bound

Radix Sort

Pseudocode

Example

Analysis

Properties

- Bucket sort
- MSD Radix Sort
  - The version shown was LSD
- Key-indexed counting sort
- ...and others