



# Algorithmic Paradigms

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## Protein Sequence FASTA format

>MCHU - Calmodulin - Human, rabbit, bovine,  
rat, and chicken

MADQLTEEQIAEFKEAFSLFDKDGDTITT  
KELGTVMRSLGQNPTEAELQDMINEVDAD  
GNGTID

FPEFLTMMARKMKDSTDSEEEIREAFRVFDK  
DGNGYISAAELRHVMTNLGEKLTDEEVDE  
MIREA

DIDGDGQVNYEEFVQMMTAK\*

# DNA Sequence FASTA format

```
>OV986001.1 Pseudomonas fluorescens SBW25  
genome assembly, chromosome: 1  
GTGTCAGTGGAACTTTGGCAGCAGTGCG  
TGGAGCTTTTGCGCGATGAGCTGCCTGCC  
CAGCAATTCAACA  
CCTGGATCCGTCCACTACAGGTCGAAGCC  
GAAGGCGACGAGTTGCGTGTTTACGCGC  
CCAATCGTTTTGT  
TCTCGACTGGGTCAACGAGAAGTACCTGA  
GCCGCGTGCTCGAATTGCTCGATGAACAC  
GGCAACGGCCTC
```

## DNA Sequence

GTGTCAGTGGAACTTTGGCAGCAGTGCG  
TGGAGCTTTTGCGCGATGAGCTGCCTGCC  
CAGCAATTCAACA  
CCTGGATCCGTCCACTACAGGTCGAAGCC  
GAAGGCGACGAGTTGCGTGTTTACGCGC  
CCAATCGTTTTGT  
TCTCGACTGGGTCAACGAGAAGTACCTGA  
GCCGCGTGCTCGAATTGCTCGATGAACAC  
GGCAACGGCCTC

# Strings in Biology

Protein: Typical length in hundreds, many letters

DNA: Length in millions, 4 letters (A,C,G,T)

# Algorithmic Problems with Strings

1. Sorting a collection of strings
2. Aligning two strings for similarity
3. Compressing one string for efficient storage

## Sorting

0: TCAG  
1: CGCCT  
2: ATT  
3: GTA  
4: CATG  
5: ACGC  
6: CCG  
7: ACGAT  
8: TCAA  
9: ATTC

ACGAT  
ACGC  
ATT  
ATTC  
CATG  
CCG  
CGCCT  
GTA  
TCAA  
TCAG

## Radix Sort: Recursive

0: TCAG

1: CGCCT

2: ATT

3: GTA

4: CATG

5: ACGC

6: CCG

7: ACGAT

8: TCAA

9: ATTC

ATT

ACGC

ACGAT

ATTC

CGCCT

CATG

CCG

GTA

TCAG

TCAA



# Radix Sort: Recursive

ATT	CGCCT
ACGC	CATG
ACGAT	CCG
ATTC	

GTA	TCAG
	TCAA

# Radix Sort: Recursive

ACGAT

CGCCT

ACGC

CATG

ATT

CCG

ATTC

GTA

TCAG

TCAA

# Radix Sort: Recursive

ACGAT

CATG

ACGC

CCG

ATT

CGCCT

ATTC

GTA

TCAG

TCAA

# Radix Sort: Recursive

ACGAT

CATG

ACGC

CCG

ATT

CGCCT

ATTC

GTA

TCAG

TCAA

# Radix Sort: Recursive

ACGAT

CATG

ACGC

CCG

ATT

CGCCT

ATTC

GTA

TCAA

TCAG

# Radix Sort: Recursive

Algorithm:

RadixSortRecursive(Strings, position):

1. Create one table for each alphabet symbol.
  2. For each string in Strings:  
    Store string in Table[string[position]].
  3. For each table T,  
    T=RadixSortRecursive(T, position+1)
  4. Strings=Concatenation of sorted tables.
- Return Strings.

# Radix Sort: Analysis

Time Complexity:

$O(Ln)$ , where  $L$ =max length of strings,  $n$ =# strings

Space Complexity:

Above Description:  $O(Ln)$

## Review Exercise:

Sort the following strings:

CCGA

TT

AATC

GTATG

GGAT

TCCG

CACAGA

AACG

CCG

ACTAG



# Radix Sort: Space Optimized

0: TCAG	ATT	CGCCT
1: CGCCT	ACGC	CATG
2: ATT	ACGAT	CCG
3: GTA	ATTC	
4: CATG		
5: ACGC		
6: CCG	GTA	TCAG
7: ACGAT		TCAA
8: TCAA		
9: ATTC		

## Radix Sort: Space Optimized

0: TCAG	2	1
1: CGCCT	5	4
2: ATT	7	6
3: GTA	9	
4: CATG		
5: ACGC		
6: CCG	3	0
7: ACGAT		8
8: TCAA		
9: ATTC		

## Radix Sort: Space Optimized

0: TCAG	2	2	1
1: CGCCT	5	5	4
2: ATT	7	7	6
3: GTA	9	9	
4: CATG	1		
5: ACGC	4		
6: CCG	6		
7: ACGAT	3	3	0
8: TCAA	0		8
9: ATTC	8		

## Radix Sort: Space Optimized

0: TCAG	2	--	5
1: CGCCT	5		7
2: ATT	7		
3: GTA	9		
4: CATG	1		
5: ACGC	4		
6: CCG	6	--	2
7: ACGAT	3		9
8: TCAA	0		
9: ATTC	8		

## Radix Sort: Space Optimized

0: TCAG	5	--	5
1: CGCCT	7		7
2: ATT	2		
3: GTA	9		
4: CATG	1		
5: ACGC	4		
6: CCG	6	--	2
7: ACGAT	3		9
8: TCAA	0		
9: ATTC	8		

## Radix Sort: Iterative

0: TCAG

1: CGCCT

2: ATT

3: GTA

4: CATG

5: ACGC

6: CCG

7: ACGAT

8: TCAA

9: ATTC

ATT

ACGC

ACGAT

ATTC

CGCCT

CATG

CCG

GTA

TCAG

TCAA

## Radix Sort: Iterative

0: ATT

1: ACGC

2: ACGAT

3: ATTC

4: CGCCT

5: CATG

6: CCG

7: GTA

8: TCAG

9: TCAA

ATT

ACGC

ACGAT

ATTC

CGCCT

CATG

CCG

GTA

TCAG

TCAA

# Radix Sort: Iterative

0: ATT

1: ACGC

2: ACGAT

3: ATTC

4: CGCCT

5: CATG

6: CCG

7: GTA

8: TCAG

9: TCAA

---

ACGC

ACGAT

---

ATT

ATTC



# Radix Sort: Iterative

0: ACGC

1: ACGAT

2: ATT

3: ATTC

4: CGCCT

5: CATG

6: CCG

7: GTA

8: TCAG

9: TCAA

---

ACGC

ACGAT

---

ATT

ATTC

# Radix Sort: Iterative

0: ACGC	CATG	CCG
1: ACGAT		
2: ATT		
3: ATTC		
4: CGCCT		
5: CATG		
6: CCG	CGCCT	---
7: GTA		
8: TCAG		
9: TCAA		

# Radix Sort: Iterative

0: ACGC	CATG	CCG
1: ACGAT		
2: ATT		
3: ATTC		
4: CATG		
5: CCG		
6: CGCCT	CGCCT	---
7: GTA		
8: TCAG		
9: TCAA		

# Radix Sort: Iterative

0: ACGC	TCAA	---
1: ACGAT		
2: ATT		
3: ATTC		
4: CATG		
5: CCG		
6: CGCCT	TCAG	---
7: GTA		
8: TCAG		
9: TCAA		

# Radix Sort: Iterative

0: ACGC	TCAA	---
1: ACGAT		
2: ATT		
3: ATTC		
4: CATG		
5: CCG		
6: CGCCT	TCAG	---
7: GTA		
8: TCAA		
9: TCAG		

## Radix Sort: Iterative

0: TCAA  
1: CGCCT  
2: ATT  
3: GTA  
4: CATG  
5: ACGC  
6: CCG  
7: ACGAT  
8: TCAG  
9: ATTC

0: ATT  
1: ACGC  
2: ACGAT  
3: ATTC  
4: CGCCT  
5: CATG  
6: CCG  
7: GTA  
8: TCAA  
9: TCAG

0: ACGC  
1: ACGAT  
2: ATT  
3: ATTC  
4: CATG  
5: CCG  
6: CGCCT  
7: GTA  
8: TCAA  
9: TCAG

0: ACGAT  
1: ACGC  
2: ATT  
3: ATTC  
4: CATG  
5: CCG  
6: CGCCT  
7: GTA  
8: TCAG  
9: TCAA

# Radix Sort: Analysis

Time Complexity:

$O(Ln)$ , where  $L$ =max length of strings,  $n$ =# strings

Space Complexity With Optimization:

$O(n+L)$

Binary encoding: Zero Additional Space