



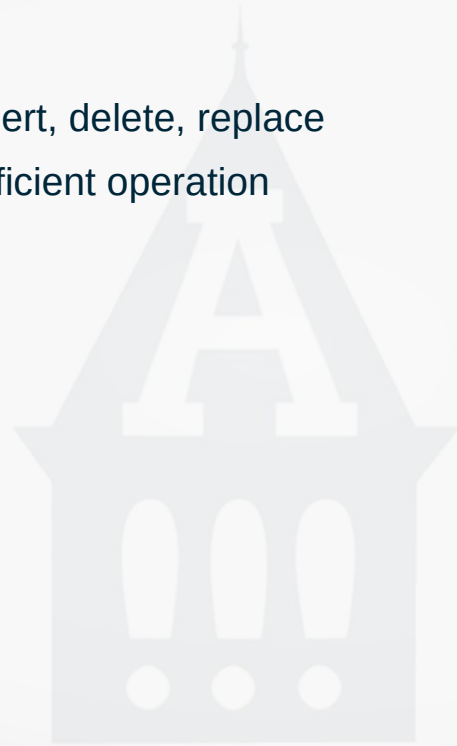
# Algorithm Design Techniques



Greedy Algorithms  
Dynamic Programming

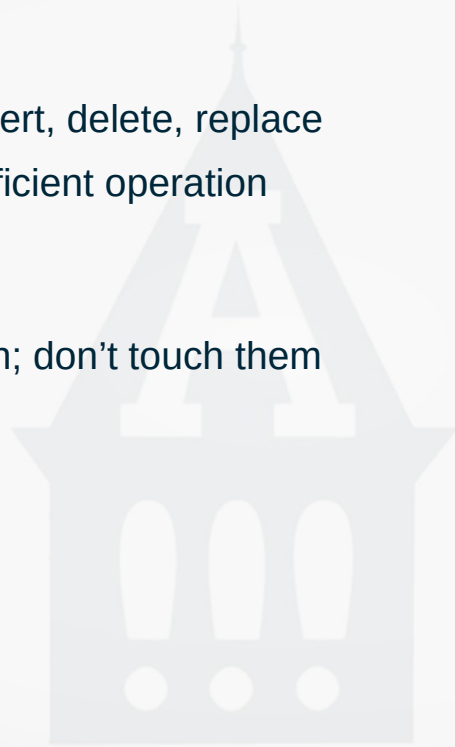
# Edit Distance

- Turn one word into another
- Three operations are possible: insert, delete, replace
- How do we determine the most efficient operation
- Example: **tire** into **admire**



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- Example: **tire** into **admire**
  - we see that **ire** and **ire** match; don't touch them
  - replace **t** with **a**: **aire**; one operation

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- Example: **tire** into **admire**
  - we see that **ire** and **ire** match; don't touch them
  - replace **t** with **a**: **aire**; one operation
  - insert **d**: **adire**; one operation

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- Turn one word into another
- Three operations are possible: ***insert***, delete, replace
- How do we determine the most efficient operation
- Example: **tire** into **admire**
  - we see that **ire** and **ire** match; don't touch them
  - replace **t** with **a**: **aire**; one operation
  - insert **d**: **adire**; one operation
  - insert **m**: **admire**; one operation

# Edit Distance

- How do we program this to determine this in an efficient way? Dynamic Programming!
  - All possible sub-strings of **tire** into **admire**

		a	d	m	i	r	e
	0	1	2	3	4	5	6
t	1	1	2	3	4	5	6
i	2	2	2	3	3	4	5
r	3	3	3	3	4	3	4
e	4	4	4	4	4	4	3

# Edit Distance

- Where did this table come from?

		a	d	m	i	r	e
	0	1	2	3	4	5	6
t	1	1	2	3	4	5	6
i	2	2	2	3	3	4	5
r	3	3	3	3	4	3	4
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# Edit Distance

- Where did this table come from?
  - Start with distance from blank to each of the sub-words (sub-problems)

		a	d	m	i	r	e
	0	1	2	3	4	5	6
t	1						
i	2						
r	3						
e	4						

# Edit Distance

- Where did this table come from?
  - Start with distance from blank to blank, 0
  - Then go to its neighbors, and compute the distance

		a	d	m	i	r	e
	0	1	2	3	4	5	6
t	1	1					
i	2						
r	3						
e	4						

t to blank: 1

blank to a: 1

blank to a (or t): 1

# Edit Distance

- Where did this table come from?
  - Just repeatedly work through cells with neighbors
  - Let's look at neighbors of t/a

The diagram shows an edit distance table for the words 'tair' and 'adme'. The table has 5 rows and 8 columns. The first column contains the characters 't', 'i', 'r', 'e' and the first row contains 'a', 'd', 'm', 'i', 'r', 'e'. The cell at row 't', column 'a' (value 1) is highlighted in orange. Three arrows point to the cells at (t, d), (i, a), and (i, d), all of which have a value of 2. Annotations explain these values: 'from a to ad by adding 1' points to (t, d); 'from t to ti by adding 1' points to (i, a); and 'from a/t to ad/ti by adding 1' points to (i, d).

		a	d	m	i	r	e
	0	1	2	3	4	5	6
t	1	1	2				
i	2	2	2				
r	3						
e	4						

from a to ad by adding 1

from t to ti by adding 1

from a/t to ad/ti by adding 1

# Edit Distance

- Where did this table come from?

from ti to tir by adding 1

from ad to adm by adding 1

		a	d	m	i	r	e
	0	1	2	3	4	5	6
t	1	1	2				
i	2	2	2	3			
r	3		3	3			
e	4						

from ad/ti to adm/tir by adding 1

# Edit Distance


- Where did this table come from?
  - Implied no-operation (matching)
  - The sub-problem of i to i, r to r, and e to e have shorter distance, therefore we keep them
  - Alternatively, the sub-problem of ire to ire is a shorter distance, therefore we keep it

		a	d	m	i	r	e
	0	1	2	3	4	5	6
t	1	1	2				
i	2	2	2	3	3		
r	3		3	3		3	
e	4						3

match, no operation

# Edit Distance

- Final result



		a	d	m	i	r	e
	0	1	2	3	4	5	6
t	1	1	2	3	4	5	6
i	2	2	2	3	3	4	5
r	3	3	3	3	4	3	4
e	4	4	4	4	4	4	3

## Edit Distance – Full Code

```
public static int minDistance(String word1, String word2) {
    int len1 = word1.length();
    int len2 = word2.length();
    int[][] dp = new int[len1 + 1][len2 + 1];

    // it takes at least this many operations
    for (int i = 0; i <= len1; i++) { dp[i][0] = i; }
    for (int j = 0; j <= len2; j++) { dp[0][j] = j; }

    for (int i = 0; i < len1; i++) {
        for (int j = 0; j < len2; j++) {
            if (word1.charAt(i) == word2.charAt(j)) {
                //no op needed to transform, same number
                dp[i + 1][j + 1] = dp[i][j];
            } else {
                // Select the best from the three operations
                int replace = dp[i][j] + 1;
                int delete = dp[i][j + 1] + 1;
                int insert = dp[i + 1][j] + 1;

                int min = replace > insert ? insert : replace;
                min = delete > min ? min : delete;
                dp[i + 1][j + 1] = min;
            }
        }
    }
}
```

# Edit Distance

- Let's take the table for a spin
  - how to turn a **blank** into **a** (1 operation)

		a	d	m	i	r	e
	0	1	2	3	4	5	6
t	1	1	2	3	4	5	6
i	2	2	2	3	3	4	5
r	3	3	3	3	4	3	4
e	4	4	4	4	4	4	3



# Edit Distance

- Let's take the table for a spin
  - how to turn a **blank** into **ad** (2 operations)

		a	d	m	i	r	e
	0	1	2	3	4	5	6
t	1	1	2	3	4	5	6
i	2	2	2	3	3	4	5
r	3	3	3	3	4	3	4
e	4	4	4	4	4	4	3

# Edit Distance

- Let's take the table for a spin
  - how to turn **t** into **a** (1 operation)

		a	d	m	i	r	e
	0	1	2	3	4	5	6
t	1	1	2	3	4	5	6
i	2	2	2	3	3	4	5
r	3	3	3	3	4	3	4
e	4	4	4	4	4	4	3

# Edit Distance

- Let's take the table for a spin
  - how to turn **ti** into **ad** (2 operations)

		a	d	m	i	r	e
	0	1	2	3	4	5	6
t	1	1	2	3	4	5	6
i	2	2	2	3	3	4	5
r	3	3	3	3	4	3	4
e	4	4	4	4	4	4	3

# Edit Distance

- Let's take the table for a spin
  - how to turn **tire** into **admi** (4 operations)

		a	d	m	i	r	e
	0	1	2	3	4	5	6
t	1	1	2	3	4	5	6
i	2	2	2	3	3	4	5
r	3	3	3	3	4	3	4
e	4	4	4	4	4	4	3

# Edit Distance

- Finally, let's find the edit distance from **tire** to **admire**
  - (notice that **ire** and **ire** match)
  - That means we focus on converting **t** to **adm**

		a	d	m	i	r	e
	0	1	2	3	4	5	6
t	1	1	2	3	4	5	6
i	2	2	2	3	3	4	5
r	3	3	3	3	4	3	4
e	4	4	4	4	4	4	3

# Edit Distance

- How do we program this to determine this in an efficient way? Dynamic Programming!
  - Focus on converting **t** to **adm**
    - 3 operations

		a	d	m	i	r	e
	0	1	2	3	4	5	6
t	1	1	2	3	4	5	6
i	2	2	2	3	3	4	5
r	3	3	3	3	4	3	4
e	4	4	4	4	4	4	3

# Edit Distance

- How do we program this to determine this in an efficient way? Dynamic Programming!
  - Focus on converting **t** to **adm**
    - 3 operations
    - Then no-ops all the way from t/adm to tire/admire

		a	d	m	i	r	e
	0	1	2	3	4	5	6
t	1	1	2	3	4	5	6
i	2	2	2	3	3	4	5
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