

# Minimum edit distance.<sup>1</sup>

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<sup>1</sup>With materials used from "Speech and Language Processing", D. Jurafsky and J. H. Martin.

# Introduction

- Need to estimate distances between strings
  - error correction:
    - user typed graffe
    - probably he meant giraffe
  - named entity recognition
    - Stanford President John Hennessy
    - Stanford University President John Hennessy
- Minimum edit distance between two strings - the minimum number of editing operations (insertion, deletion, substitution) needed to transform one string into another.
  - each editing operation has cost 1
  - however we may assign different costs

## Example

Distance from [intention] to [execution] is 5.

- Optimal (minimum loss) conversion path:

```

i n t e n t i o n ← delete i
n t e n t i o n ← substitute n by e
e t e n t i o n ← substitute t by x
e x e n t i o n ← insert u
e x e n u t i o n ← substitute n by c
e x e c u t i o n

```

- Optimal path is found with dynamic programming.
- Main idea of dynamic programming: if path  $X \rightarrow Y$  is optimal and it passes through  $Z$  then path  $X \rightarrow Z$  should also be optimal (otherwise original path can be improved).

## Definitions

Define

- $X$ -input string,  $Y$ -target string.
- $len(X) = n, len(Y) = m$
- $X[1..i]$ -substring, consisting of first  $i$   $X$  symbols.
- $D(i, j)$  distance between  $X[1..i]$  and  $Y[1..j]$
- Then distance between  $X$  and  $Y$  is  $D(n, m)$

## Minimum edit distance calculation

- $D(0, j) =$  cost of  $j$  insertions
- $D(i, 0) =$  cost of  $i$  deletions
- Recurrent recalculation:

$$D[i, j] = \min \begin{cases} D[i-1, j] + \text{del-cost}(\text{source}[i]) \\ D[i, j-1] + \text{ins-cost}(\text{target}[j]) \\ D[i-1, j-1] + \text{sub-cost}(\text{source}[i], \text{target}[j]) \end{cases}$$

## Demo

	#	e	x	e	c	u	t	i	o	n
#	0	1	2	3	4	5	6	7	8	9
i	1	↖↔2	↖↔3	↖↔4	↖↔5	↖↔6	↖↔7	↖6	←7	←8
n	2	↖↔3	↖↔4	↖↔5	↖↔6	↖↔7	↖↔8	↑7	↖↔8	↖7
t	3	↖↔4	↖↔5	↖↔6	↖↔7	↖↔8	↖7	↖↔8	↖↔9	↑8
e	4	↖3	←4	↖↔5	←6	←7	↖↔8	↖↔9	↖↔10	↑9
n	5	↑4	↖↔5	↖↔6	↖↔7	↖↔8	↖↔9	↖↔10	↖↔11	↖↔10
t	6	↑5	↖↔6	↖↔7	↖↔8	↖↔9	↖8	←9	←10	↖↔11
i	7	↑6	↖↔7	↖↔8	↖↔9	↖↔10	↑9	↖8	←9	←10
o	8	↑7	↖↔8	↖↔9	↖↔10	↖↔11	↑10	↑9	↖8	←9
n	9	↑8	↖↔9	↖↔10	↖↔11	↖↔12	↑11	↑10	↑9	↖8

## Optimal path

- We can find optimal transformations path by
  - storing the optimal steps in each  $D(i, j)$  recalculation
  - after  $D(n, m)$  is found, backtrace the optimal path
- Optimal path is equivalent to alginement of 2 strings:

```

I N T E * N T I O N
| | | | | | | |
* E X E C U T I O N
d s s   i s

```

d=deletion, s=substitution, i=insertion.