

Understanding string distances




INTERMEDIATE REGULAR EXPRESSIONS IN R



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What is a string distance?

0	r a i n
1	r a n
2	r u n

-  insertion
-  deletion
-  substitution

What is a string distance?

0	s u n d a y
1	s u r d a y
2	s a u r d a y
3	s a t u r d a y

 insertion
 deletion
 substitution

Real world applications

```
0   E m i l e   B r o w n
```

```
1   E m i l i e   B r o w n
```

dotcors in zurich



About 269 results (0.32 seconds)

Did you mean: **doctors** in zurich

The Four String Company - Home | Facebook

<https://en-gb.facebook.com> › Pages › Public figure › Artist

The Four String Company. 176 likes. We're the Four String Company, an acroba duo combining partner acrobatics with two live violins and a...

String distances in R

```
library(stringdist)  
stringdist("saturday", "sunday", method = "lv")
```

Returns:

```
3
```

Is identical:

```
stringdist("sunday", "saturday", method = "lv")
```

Finding a match

```
amatch(  
  x = "Sonday",  
  table = c("Friday", "Saturday", "Sunday"),  
  maxDist = 1,  
  method = "lv"  
)
```

Returns:

3

Let's practice!

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Methods of string distances

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Damerau-Levenshtein

Regular Levenshtein distance

0 R c i k C a p l a n

1 R i k C a p l a n

2 R i c k C a p l a n

Damerau-Levenshtein distance

0 R c i k C a p l a n

1 R i c k C a p l a n

 transposition

Method abbreviations

Regular Levenshtein distance:

```
stringdist(a, b, method = "lv")
```

Damerau-Levenshtein distance:

```
stringdist(a, b, method = "dl")
```

Optimal String Alignment distance:

```
stringdist(a, b, method = "osa")
```

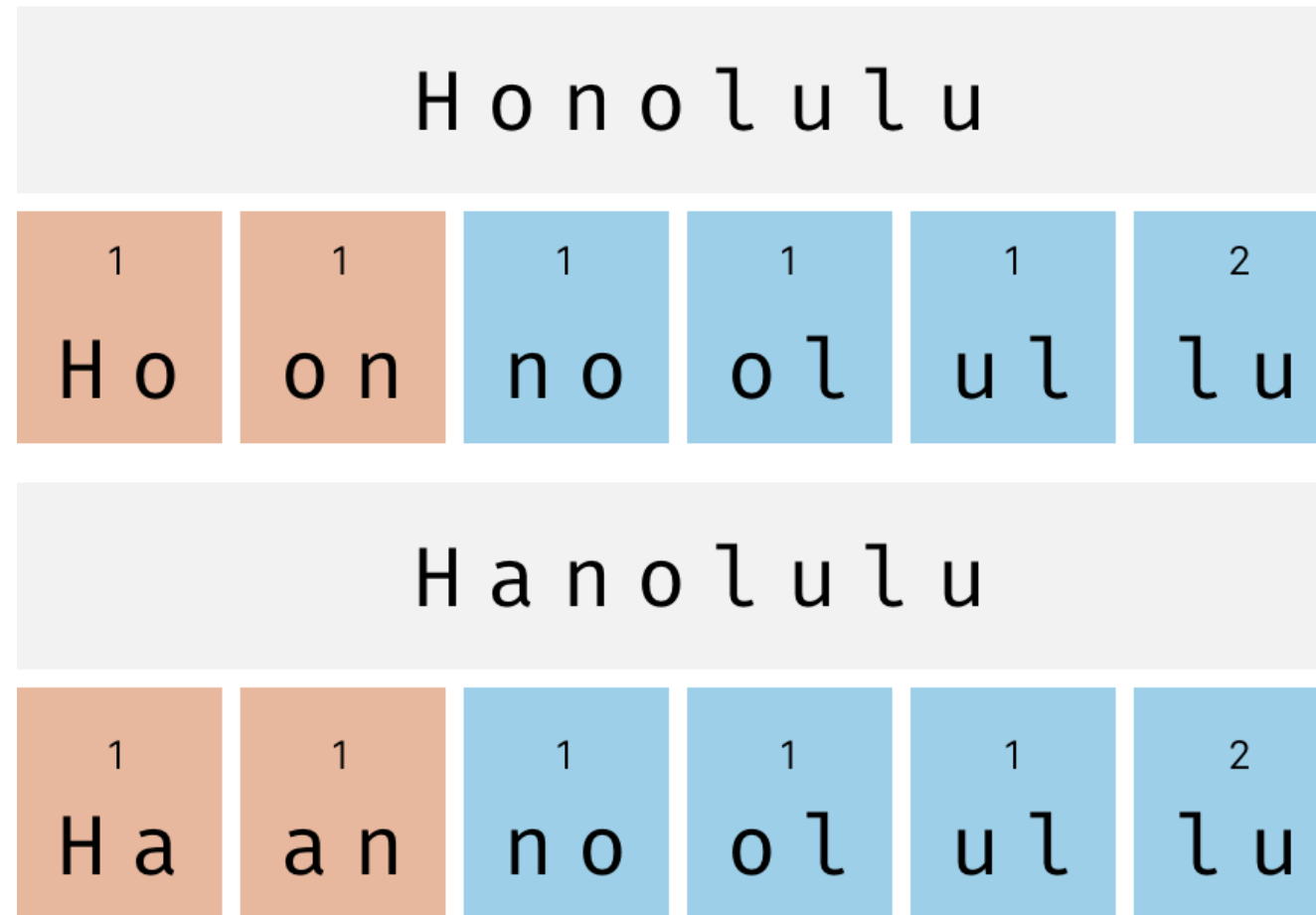
Q-Grams (or n-grams)

Q-Grams ($q = 2$)

H o n o l u l u					
1	1	1	1	1	2
H o	o n	n o	o l	u l	l u

Q-Grams (or n-grams)

Q-Grams ($q = 2$)



matches

differences

Inspecting q-grams

```
qgrams("Honolulu", "Hanolulu", q = 2)
```

Returns:

	Ho	on	ul	no	ol	lu	la
V1	1	1	1	1	1	2	0
V2	1	1	1	1	1	1	1

Method abbreviations

Sum of qgrams that are not shared

```
stringdist(a, b, method = "qgram") # equals 4
```

Not shared qgrams divided by total number of qgrams

```
stringdist(a, b, method = "jaccard") # equals 0.5
```

Optimal String Alignment distance

```
stringdist(a, b, method = "cosine") # equals 0.22
```

Let's practice!

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Fuzzy joins

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A regular join

Table a

user_name	user_id
Bryan	1
Barbara	2
Tom	3

Table b

user_id	email
1	bryan@example.com
3	tom@example.com
2	barbara@example.com

Joined

user_name	user_id	email
Bryan	1	bryan@example.com
Barbara	2	barbara@example.com
Tom	3	tom@example.com

A fuzzy join

Table a

user_input
Brian
Barbra
Thom

Table b

name	email
Bryan	bryan@example.com
Tom	tom@example.com
Barbara	barbara@example.com

Joined

user_input	name	email
Brian	Bryan	bryan@example.com
Thom	Tom	tom@example.com
Barbra	Barbara	barbara@example.com

The fuzzyjoin package

```
library(fuzzyjoin)
```

```
stringdist_join(  
  user_input,  
  database,  
  by = c("user_input" = "name"),  
  method = "lv",  
  max_dist = 1,  
  distance_col = "distance"  
)
```

stringdist_join: Result

user_input	name	email	distance
Brian	Bryan	bryan@example.com	1
Thom	Tom	tom@example.com	1
Barbra	Barbara	barbara@example.com	1

Let's practice!

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Custom Fuzzy Matching

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Combining two fuzzy matches

Table a

title	year
Star Wars: Episode III	2005
The Children Of Men	2006
The Pursuit Of Happyness	2007
Twilight Saga, The: Breaking Dawn, Teil 1	2011
Wild Tales - Relatos Salvajes	2015
X-Men 3	2006

Table b

prod_title	prod_year	external_id
Star Wars 3 – Episode III	2004	Q42051
Children of Men	2006	Q221090
The Prusuit of Happiness	2005	Q19608917
The Pursuit Of Happyness	2015	Q220515
The Twilight Saga: Breaking Dawn	2010	Q60506
Wild Tales	2015	Q16672466
X-Men 3	2006	Q221168
X-Men 2	2001	Q12578

Combining two fuzzy matches

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Fuzzy matches: Helper functions

For the string comparison:

```
small_str_distance <- function(left, right) {  
  stringdist(left, right) <= 5  
}
```

For the number comparison:

```
close_to_each_other <- function(left, right) {  
  abs(left - right) <= 3  
}
```

The fuzzy join

```
fuzzy_left_join(  
  a, b,  
  by = c(  
    "title" = "prod_title",  
    "year" = "prod_year"  
  ),  
  match_fun = c(  
    "title" = small_str_distance,  
    "year" = close_to_each_other  
  )  
)
```

The fuzzy join: The result

Joined

title	year	prod_title	prod_year	external_id
Star Wars: Episode III	2005	Star Wars 3 – Episode III	2004	Q42051
The Children Of Men	2006	Children of Men	2006	Q221090
The Pursuit Of Happyness	2007	The Prusuit of Happiness	2005	Q19608917
Twilight Saga, The: Breaking Dawn, Teil 1	2011			
Wild Tales - Relatos Salvajes	2015			
X-Men 3	2006	X-Men 3	2006	Q221168

Let's practice!

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Congratulations

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A look back

1. Regular Expressions: Writing custom patterns

- `str_view()` , `str_match()` , `str_detect()` ...

2. Creating strings with data

- `glue()` , `glue_collapse()` , ...

3. Extracting structured data from text

- `str_extract_all()` , `extract()` , ...

4. Similarities between strings

- `stringdist()` , `amatch()` , `stringdist_join()`

Next courses

- [Introduction to Text Analysis in R](#)
- [Introduction to Natural Language Processing in R](#)
- [Text Mining with Bag-of-Words in R](#)
- [Sentiment Analysis in R](#)

Thank you!

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