# Speech and Language Processing

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### 1 Introduction

# 2 Regular Expressions, Text Normalisation, Edit Distance

Regular expressions are the most important tool for describing text patterns. Text normalisation is the process of converting text to a more standard form: for example, tokenisation (splitting up text into words), lemmatisation (identifying common roots) or stemming (removing suffixes), and sentence segmentation (splitting up text into sentences).

Edit distance is a metric that measures how similar two strings are.

## 2.1 Regular Expressions

Formally, a regular expression is an algebraic notation for characterising a set of strings. They are useful for searching in texts.

#### 2.1.1 Basic Regular Expression Patterns

The simplest kind of regular expression is just a sequence of characters, like /woodchuck/ [slashes are not part of expressions]. Regexes are case sensitive.

We can use braces, which indicate disjunctions, to solve this issue. To match both *woodchucks* and *Woodchucks*, we can use /[ww]oodchucks/.

Ranges can be specified using the hyphen; e.g. / [A-Z]/ matches any uppercase letter.

A caret in the *beginning* of the square braces expression can be used to specify a "negative" pattern: what the character shouldn't be. Thus /[^0-9]/ matches any character that is not a number (the caret negates the entire expression inside the brackets).

A question marks indicates "the previous character or nothing"; for instance /woodchucks?/ matches woodchuck and woodchucks.

The Kleene star or asterisk allows us to match zero or more occurrences of a character. Therefore /a\*/ matches any string of 0 or more a's. Similarly, /aa\*/ matches one or more a's; /[ab]\*/ matches all strings consisting only of a's and b's; and so on.

One useful example is /[0-9][0-9]\*/, which matches any nonnegative integer. For convenience, the Kleene plus can be used to indicate one or more occurences; thus /[0-9]+/.

The period is a wildcard expression that matches any single character *except* a carriage return. Therefore /beg.n/ matches *begin*, *begun*, *began*, etc.

/.\*/ is used often and means "any string of characters".

Anchors are special characters that indicate where in a string we wish the regex to match. The caret indicates the beginning and the dollar indicates the end. Thus  $\ ^The \$ matches  $\$ The if it's the first word, and  $\$ \$/ matches a space at the end of a line.

Other anchors are \b for a word boundary, and \B for a non-boundary. A word is defined as any sequence of digits, letters or underscores.

#### 2.1.2 Disjunction, Grouping and Precedence

The disjunction operators for strings is the pipe; thus /cat|dog/ matches either cat or dog.

Precedence is overridden using ordinary parentheses, as in /gupp(y|ies)/, which matches *quppy* and *quppies*.

Note that the Kleene star matches only the preceding character, and therefore needs parens to cover an entire regex. Therefore /(Column [0-9]+\*)\*/ matches any repetition of the word Column, followed by a space and an integer, followed by any number of spaces.

The precedence order for operators is ()  $> *,+,?,{}$   $> ^,seqs > |$ .

To avoid ambiguity, regexes are defined to match greedily: they match the largest possible string. However, the ? qualifier can be used to enforce non-greedy matching.

#### 2.1.3 A Simple Example

To match all occurrences of *the*, we could say /the/; but it won't match *The*. /[tT]he/ would, but it would match part of *theology* also.

/\b[tT]he\b/ wouldn't, but words aren't defined the same.

 $/[^a-zA-Z][tT]he[^a-zA-Z]/$  would work, but it would only match if there was some character preceding *the*, and some character following it.

 $/(^|[^a-zA-Z])[tT]he([^a-zA-Z]|$)/$  would work.

The above procedure illustrates two efforts in developing speech and language processing systems:

- increasing precision (reducing false +ves), and
- increasing recall (reducing false –ves).

#### 2.1.4 A More Complex Example