## School of Computing and Information Systems The University of Melbourne

## COMP90049 Knowledge Technologies (Semester 2, 2017) Workshop exercises: Week 4

Suppose that we have observed the token lended, and we have a dictionary as follows:

addendum
blenders
commodity
deaden
end
leader
leant
lent
lemonade
pleading

- 1. Which, if any, of the above dictionary entries would be returned using a Neighbourhood Search with a neighbourhood of 1? 2? 3?
  - There aren't any items in the dictionary requiring only a single change from lended.
  - With a neighbourhood size of 2, there is a dictionary entry:
    - leader, by Replacing the n with a, and the second d with r
  - Along with the above, the following are also within a neighbourhood of 3:
    - blenders, by Inserting the b, Replacing the second d with r, and Inserting the s
    - deaden (three Replaces)
    - end (three Deletions)
    - lent (one Replace and two Deletions)
- 2. With respect to the input string lended and the dictionary entry deaden, calculate the following:
  - (a) the Global Edit Distance, using the parameter [m, i, d, r] = [+1, -1, -1, -1]

(a)	$\varepsilon$		1		е		n		d		е		d
$\varepsilon$	0	$\leftarrow$	-1	$\leftarrow$	-2	$\leftarrow$	-3	$\leftarrow$	-4	$\leftarrow$	-5	$\leftarrow$	-6
	1	_		_		_		_				_	
d	-1		-1	$\leftarrow$	-2	$\leftarrow$	-3			$\leftarrow$	-3	$\leftarrow$	-4
	1	_	$\uparrow$	_						_			
е	-2		-2		0	$\leftarrow$	-1	$\leftarrow$	-2		-1	$\leftarrow$	-2
	↑	_	$\uparrow$		$\uparrow$	_		_			$\uparrow$	_	
a	-3		-3		-1		-1	$\leftarrow$	-2		-2		-2
	1	_	$\uparrow$		$\uparrow$	_	$\uparrow$	_				_	
d	-4		-4		-2		-2		0	$\leftarrow$	-1		-1
	1	_	$\uparrow$	_	$\uparrow$	_	$\uparrow$		$\uparrow$	_			
е	-5		-5		-3		-3		-1		1	$\leftarrow$	0
	1	_	$\uparrow$		$\uparrow$	_			$\uparrow$		$\uparrow$	K	
n	-6		-6		-4		-2		-2		0		0

• From the above table, we can observe that the Global Edit Distance is 0, corresponding to the following sequence of operations: Replace, Match, Replace, Match, Match, Replace, which I will abbreviate as rmrmmr. (You can follow along with the highlighted backpointers.)

(b)	$\varepsilon$	1	е	n	d	е	d
$\varepsilon$	0	0	0	0	0	0	0
				7		_	
d	0	0	0	0	1	$\leftarrow 0$	1
		1					
е	0	0	1 +	- 0	0	$2 \leftarrow$	1
			<b>↑</b> ×			<b>↑</b>	
a	0	0	0	0	0	1	1
				7			
d	0	0	0	0	1	$\leftarrow 0$	2
		1			$\uparrow$		$\uparrow$
е	0	0	1 ←	- 0	0	$2 \leftarrow$	1
			<b>↑</b> ×			↑ <u> </u>	
n	0	0	0	2	<b>←</b> 1	1	1

- (b) the Local Edit Distance, using the parameter [m, i, d, r] = [+1, -1, -1, -1]
  - From the above table, we can observe that the Local Edit Distance is 2 (highlighted); there are five equivalent-scoring substring matches that it corresponds to:
    - Align -de- in lended with the first de- in deaden: mm
    - Align -ded with dead-: mmim
    - Align -de- in lended with the second -de- in deaden: mm
    - Align -ende- with -eade-: mrmm
    - Align -en- with -en: mm
- (c) the N-Gram Distance, using n=2
  - We begin by generating the 2-grams of the two strings; I will use the terminal marker (#) here:
    - lended: #1, le, en, nd, de, ed, d#
    - deaden: #d, de, ea, ad, de, en, n#
  - Recall that the N-Gram Distance is defined as follows:

$$D(s,t) = |G_n(s)| + |G_n(t)| -2 \times |G_n(s) \cap G_n(t)|$$

- Here we have 7 2-grams in lended, as well as 7 in deaden. Also, the two sets share 2 2-grams: de and en. (Note that we don't double-count the des in deaden, because there is only a single de in lended)
- Consequently, the 2-gram Distance is  $7 + 7 2 \times 2 = 10$
- 3. Find the best approximate match (or matches, if there are ties) in the dictionary for the string lended, based on the following methods; consider different parameters where necessary:
  - (a) the Global Edit Distance
    - Using the above scoring parameter, the closest matches are blenders (+2) and leader (+2)
    - You might like to try some other parameter setting, to see if they give different results.
  - (b) the Local Edit Distance
    - Using the above scoring parameter, the closest match is blenders (+5)
    - In this case, changing the parameter is unlikely to result in a different answer. (Why?)
  - (c) the N-Gram Distance
    - If we are using n is 2 and padding with #, the best dictionary entry is lent, with a 2-Gram Distance of 6.
    - You might find that removing the padding characters or changing n will give different results.

## (d) Soundex

- The Soundex code of lended is 1533.
- None of the dictionary entries have this exact code; however, if we permit mismatches in the Soundex code, then the best matches are commodity (c533), leant (153), lent (153), and lemonade (1553)
- 4. Assuming that the "correct" (intended) dictionary entry was lent, calculate the precision of each of the above methods of finding approximate entries from the dictionary.
  - For each method, we will consider how many dictionary entries it returns as a result (predicts as a good match), as well as how many it got correct in this case, there is only a single correct answer, so the value will be 0 or 1.
  - We have quite a few methods above!
    - Neighbourhood Search, with a neighbourhood of 1: there we're any results returned from the dictionary, so precision isn't well-defined  $(\frac{0}{0})$
    - Neighbourhood Search, with a neighbourhood of 2: there was one entry returned from the dictionary (leader), but it wasn't lent, so the precision is  $\frac{0}{1} = 0$ .
    - Neighbourhood Search, with a neighbourhood of 3: there were five entries returned from the dictionary, and lent was one of them. The precision of this system is the number of correct responses (1) out of the total number of attempted responses (5),  $\frac{1}{5} = 20\%$
    - Global Edit Distance: there were two results from the dictionary (blenders and leader), but no lent, so the precision is  $\frac{0}{2} = 0$
    - Local Edit Distance: there was just a single result (blenders) which wasn't lent, so the precision is 0
    - N-Gram Distance: there was a single result which was lent, so the precision is  $\frac{1}{1} = 100\%$
    - Soundex: there weren't any exact matches with the Soundex code of lended, so precision isn't well defined
    - Soundex (allowing approximate matches): allowing approximate matches of the Soundex code meant that there were four results, including lent, so the precision is  $\frac{1}{4} = 25\%$
  - Here, the best method according to precision was the N-Gram Distance. However, if we wanted to seriously compare these methods, we would need to aggregate these results over a large number of inputs; just considering a single word is not enough information to draw solid conclusions.
  - (In fact, the fact that the N-Gram Distance uniquely found the correct result was mostly an accident of its bias toward shorter strings; you might like to think about why this happens.)