

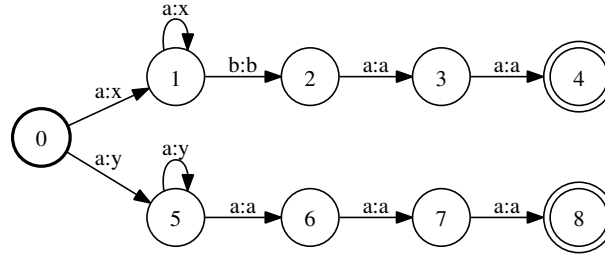
CMPT 413 - Spring 2013 - Midterm

There are three questions (25pts). Please write down “Midterm” on the top of the answer booklet.

When you have finished, return your answer booklet along with this question booklet.

(1) (5pts) **Finite-state transducers:**

For the following finite-state transducer provide exactly two rewrite rules that defines the same regular relation. Both the rewrite rules must be left to right obligatory rules. Use regular expression ‘^’ to match the start of string and ‘\$’ to match the end of string.



Hint: It is nonsensical to write down a replacement rule like $a^* \rightarrow x^*$ or $a^n \rightarrow x^n$ regardless of the left or right context. However, it is correct to use x^* in the left or right context.

Answer: The regular relation can be defined verbally as follows: for any $n \geq 1$ if the input is a^nbaa then the output is x^nbaa , and if the input is a^{n+3} then the output is y^naaa .

$$a \rightarrow x/^{\wedge} _ a^*baa\$$$

$$a \rightarrow y/^{\wedge} _ a^*aaa\$$$

The following solution works for $n \geq 0$ (note that the above FST corresponds to the $n \geq 1$ case):

$$a \rightarrow x/_ _ x^*baa\$$$

$$a \rightarrow y/_ _ y^*aaa\$$$

(2) **Edit distance:** Assume insertion of a character has cost 1, deletion has cost 1, and substitution of one character for another has cost 2.

- a. (2pts) What is the minimum edit distance value between target word *goal* and source word *hole*?
- b. (3pts) The following is a visual display of one possible alignment between target word *goal* and source word *hole* using the usual notation.

```

g o a l _
|   |
h o _ l e
  
```

Using the above notation for alignments, provide any other possible alignments that have the same

edit distance as the alignment shown above.

Answer:

levenshtein distance = 4

alignment number 1 for [4,4]:

```
_ g o a l _  
    |   |  
h _ o _ l e
```

alignment number 2 for [4,4]:

```
g _ o a l _  
    |   |  
_ h o _ l e
```

alignment number 3 for [4,4]:

```
g o a l _  
    |   |  
h o _ l e
```

total of 3 alignments

(3) **Hidden Markov Models:**

The probability model $P(t_i | t_{i-2}, t_{i-1})$ is provided below where each t_i is a part of speech tag, e.g. the sixth row of the left table below corresponds to $P(D | N, V) = \frac{1}{3}$. Also provided is $P(w_i | t_i)$ that a word w_i has a part of speech tag t_i , e.g. the seventh line of the right table below corresponds to $P(\text{flies} | V) = \frac{1}{2}$.

$P(t_i t_{i-2}, t_{i-1})$	t_{i-2}	t_{i-1}	t_i
1	bos	bos	N
$\frac{1}{2}$	bos	N	N
$\frac{1}{2}$	bos	N	V
$\frac{1}{2}$	N	N	V
$\frac{1}{2}$	N	N	P
$\frac{1}{3}$	N	V	D
$\frac{1}{3}$	N	V	V
$\frac{1}{3}$	N	V	P
1	V	D	N
1	V	V	D
1	N	P	D
1	V	P	D
1	P	D	N
1	D	N	eos

$P(w_i t_i)$	t_i	w_i
1	D	an
$\frac{2}{5}$	N	time
$\frac{2}{5}$	N	arrow
$\frac{1}{5}$	N	flies
1	P	like
$\frac{1}{2}$	V	like
$\frac{1}{2}$	V	flies
1	eos	eos
1	bos	bos

The part of speech tag definitions are: bos (*begin sentence marker*), N (*noun*), V (*verb*), D (*determiner*), P (*preposition*), eos (*end of sentence marker*).

- a. (10pts) Provide a Hidden Markov Model (*hmm*) that uses the trigram part of speech probability $P(t_i | t_{i-2}, t_{i-1})$ as the transition probability $P_{hmm}(s_j | s_k)$ and the probability $P(w_i | t_i)$ as the emission probability $P_{hmm}(w_j | s_j)$.

Important: Provide the *hmm* in the form of two tables as shown below. The first table contains transitions between states in the *hmm* and the transition probabilities and the second table contains the words emitted at each state and the emission probabilities. Do not provide entries with zero probability.

from-state s_k	to-state s_j	$P(s_j s_k)$	state s_j	emission w	$P(w s_j)$

Hint: In your *hmm* the state $\langle N, \text{eos} \rangle$ will have emission of word eos with probability 1 and will not

have transitions to any other states.

Answer: Here are the two tables that define the HMM, the transition table on the left and the emission table on the right:

from-state s_k	to-state s_j	$P(s_j s_k)$
bos, bos	bos, N	$P(N bos, bos) \quad 1$
bos, N	N, N	$P(N bos, N) \quad \frac{1}{2}$
bos, N	N, V	$P(V bos, N) \quad \frac{1}{2}$
N, N	N, V	$P(V N, N) \quad \frac{1}{2}$
N, N	N, P	$P(P N, N) \quad \frac{1}{2}$
N, V	V, D	$P(D N, V) \quad \frac{1}{3}$
N, V	V, V	$P(V N, V) \quad \frac{1}{3}$
N, V	V, P	$P(P N, V) \quad \frac{1}{3}$
V, D	D, N	$P(N V, D) \quad 1$
V, V	V, D	$P(D V, V) \quad 1$
N, P	P, D	$P(D N, P) \quad 1$
V, P	P, D	$P(D V, P) \quad 1$
P, D	D, N	$P(N P, D) \quad 1$
D, N	N, eos	$P(eos D, N) \quad 1$

state s_j	emission w	$P(w s_j)$
bos, bos	bos	1
bos, N	time	$\frac{2}{5}$
bos, N	arrow	$\frac{1}{5}$
bos, N	flies	$\frac{1}{5}$
N, N	time	$\frac{1}{2}$
N, N	arrow	$\frac{1}{2}$
N, N	flies	$\frac{1}{2}$
N, V	like	$\frac{1}{2}$
N, V	flies	$\frac{1}{2}$
V, D	an	1
V, V	like	$\frac{1}{2}$
V, V	flies	$\frac{1}{2}$
N, P	like	1
V, P	like	1
P, D	an	1
D, N	time	$\frac{2}{5}$
D, N	arrow	$\frac{1}{5}$
D, N	flies	$\frac{1}{5}$

- b. (5pts) Based on your *hmm* constructed in 3a. what is the state sequence with the highest probability for the following observation sequence:

bos bos time flies like an arrow eos

Answer:

bos	time	flies	like	an	arrow	eos	
(bos,bos)	(bos,N)	(N,V)	(V,P)	(P,D)	(D,N)	(N,eos)	
1	$\times 1 \times \frac{2}{5}$	$\times \frac{1}{2} \times \frac{1}{2}$	$\times \frac{1}{3} \times 1$	$\times 1 \times 1$	$\times 1 \times \frac{2}{5}$	$\times 1 \times 1$	$= \frac{1}{75}^*$
(bos,bos)	(bos,N)	(N,V)	(V,V)	(V,D)	(D,N)	(N,eos)	
1	$\times 1 \times \frac{2}{5}$	$\times \frac{1}{2} \times \frac{1}{2}$	$\times \frac{1}{3} \times \frac{1}{2}$	$\times 1 \times 1$	$\times 1 \times \frac{2}{5}$	$\times 1 \times 1$	$= \frac{1}{150}$
(bos,bos)	(bos,N)	(N,N)	(N,P)	(P,D)	(D,N)	(N,eos)	
1	$\times 1 \times \frac{2}{5}$	$\times \frac{1}{2} \times \frac{1}{5}$	$\times \frac{1}{2} \times 1$	$\times 1 \times 1$	$\times 1 \times \frac{2}{5}$	$\times 1 \times 1$	$= \frac{1}{125}$
(bos,bos)	(bos,N)	(N,N)	(N,V)	(V,D)	(D,N)	(N,eos)	
1	$\times 1 \times \frac{2}{5}$	$\times \frac{1}{2} \times \frac{1}{5}$	$\times \frac{1}{2} \times \frac{1}{2}$	$\times \frac{1}{3} \times 1$	$\times 1 \times \frac{2}{5}$	$\times 1 \times 1$	$= \frac{1}{750}$