**CSE 537 - Artificial Intelligence**

**Report: Project 3**

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## **Word Cross: Finding the missing letter in an incomplete word**

## **Q1. Returning the most possible missing letter**

**Methodology Used:** Using the CPT table given. Visualizing the query set as a Markov Chain of the form a -> B -> c. B being blank position under consideration to be found out. Probability for each assignment to B is computed by considering each of the ascii lowercase characters including (`) and then returning most likeliest character with highest conditional probability calculated with a,c & set of ascii characters.

**Probability Evaluation Function: P (b, a) \* P (c, b)**

**Execution Details**

**Command 1:**

python wordCross.py –q1 --test

***Accuracy*: 1.000000**

***Time used:* 0.0010000 secs**

**Command 2:**

python wordCross.py –q1

**Accuracy: 0.311102**

**Time used: 0.196000 secs.**

**Q2. Return the most possible missing two consecutive letters**

**Methodology Used:** Using the CPT table given. Visualizing the query set as a Markov Chain of the form a -> B -> C -> d. B & C being blank position under consideration to be found out. Probability for each assignment to B & C is computed by considering each of the ascii lowercase characters including (`) and then returning most likeliest characters with highest conditional probability calculated with a,d & set of ascii characters.

**Probability Evaluation Function: P (b, a) \* P (c, b) \* P (d, c)**

**Execution Details**

**Command 1:**

python wordCross.py –q2 --test

**Accuracy:** 1.000000 (two correct letters)

**Accuracy:** 1.000000 (at least one correct letter)

**Time used:** 0.004000 secs.

**Command 2:**

python wordCross.py –q2

**Accuracy: 0.089656 (two correct letters)**

**Accuracy: 0.360026 (at least one correct letter)**

**Time used: 6.077000 secs.**

**Q3. Return the most possible missing letter**

**Methodology Used:** We Visualize the query as a Markov Chain of a->? -> C ->? ->e. C represents the letter we are looking for at (\_). a & e are known/given letters in the query.

Query gu--\_--n can be set up as following chain: u->??->C->??->n. The level of indirection between a=’u’ and C is 2, we represent it by h, similarly t for C and e.

Let’s break down the problem this way: The probability of having letter C=c given a=a followed by two hidden variables a -> H1 -> c is given by Sum (P (H1|a) \* P (c|H1) for all h=H. All the one and two level of hidden values are pre-computed this way and is accessible using the defined getConditionalProbability function ( This function helps in getting the CPT based on the number of hidden variables.)

Then we compute the probability of each assignments of C from the set of all lowercase characters including ` and returning most likeliest character with highest conditional probability using probability evaluation function as defined below.

**Probability Evaluation Function: P (h, c, a) \* P (t, e, c)**

**Execution Details**

**Command 1:**

python wordCross.py –q3 --test

**Accuracy: 1.000000**

**Time used: 0.025000 secs**

**Command 2:**

python wordCross.py –q3

**Accuracy: 0.149693**

**Time used: 0.278000 secs**

**Q4. Return the most possible missing letter – Given Graphical Model**

**Methodology Used:** We visualize the queries as finding the likely letter in the blank space of intersection of four words, having the knowledge of neighboring letters. Representation of the form:

a1->? ->C->? ->e1

a2->? ->C->? ->e2

a3->? ->C->? ->e3

a4->? ->C->? ->e4

where C represents letter in the blank intersection and a1, e1, a2, e2, a3, e3, a4, e4 are known letters of four words.

Similar to Q3, the probability of having the letter C=c, given a=a followed by two hidden letters a->H1->c is given by Sum (P (H1|a) \* P (c|H1), for all h=H). All the one and two level of hidden values are pre-computed this way and is accessible using the defined getConditionalProbability function ( This function helps in getting the CPT based on the number of hidden variables.).

Here we take the intersection of four letters, the probability of C=c is product of P (c|ai) \* P (ei|c), for i= [1, 4], P is the probability of the hidden intermediate variables.

Then we compute the probability of each assignments of C from the set of all lowercase characters including ` and returning most likeliest character with highest conditional probability using probability evaluation function as defined below.

**Probability Evaluation Function: P (h1, c, a1) \* P (t1, e1, c) \* P (h2, c, a2) \* P (t2, e2, c2) \* P (h3, c, a3) \* P (t3, e3, c) \* P (h4, c, a4) \* P (t4, e4, c)**

**Execution Details**

**Command 1:**

python wordCross.py –q4 --test

**Accuracy: 1.000000**

**Time used: 0.025000 secs**

**Command 2:**

python wordCross.py –q4

**Accuracy: 0.426571**

**Time used: 1.006000 secs**

**Q5. Based on Second Order Markov Chain- Return the most possible missing letter**

**Methodology Used:**

We visualize the query as 2nd Order Markov Chain of the following form:

a->b->C->d->e

where C represent the letter to be found out. a,b,d,e are known letter of the word.

Eg: ques\_ion => e->s->C->i->o

Probability for each assignment to C is computed by considering each of the ascii lowercase characters including (`) and then returning most likeliest character with highest conditional probability calculated with a,b,d,e & set of ascii characters.

**Probability Evaluation Function: P (c, a, b) \* P (d, b, c) \* P (e, c, d)**

**Execution Details**

**Command 1:**

python wordCross.py –q5 --test

**Accuracy: 1.000000**

**Time used: 0.002000 secs**

**Command 2:**

python wordCross.py –q5

**Accuracy: 0.465159**

**Time used: 0.351000 secs**

**Appendix:**

>python wordCross.py -q1 -q2 -q3 -q4 -q5 --test

Question 1 accuracy: 1.000000

Q1 time used: 0.001000 secs.

Question 2 accuracy: 1.000000 (two correct letters)

Question 2 accuracy: 1.000000 (at least one correct letter)

Q2 time used: 0.004000 secs.

Question 3 accuracy: 1.000000

Q3 time used: 0.025000 secs.

Question 4 accuracy: 1.000000

Q4 time used: 0.025000 secs.

Question 5 accuracy: 1.000000

Q5 time used: 0.002000 secs.

>python wordCross.py -q1 -q2 -q3 -q4 -q5

Question 1 accuracy: 0.311102

Q1 time used: 0.196000 secs.

Question 2 accuracy: 0.089656 (two correct letters)

Question 2 accuracy: 0.360026 (at least one correct letter)

Q2 time used: 6.077000 secs.

Question 3 accuracy: 0.149693

Q3 time used: 0.278000 secs.

Question 4 accuracy: 0.426571

Q4 time used: 1.006000 secs.

Question 5 accuracy: 0.465159

Q5 time used: 0.351000 secs.