



Spring Deferrals 2021/2022

Course Code(s)	Instance	1CSD1, 1CSD2, 1SPE1, 1MAO2, 1MAI1
Exam(s)		MSc in Computer Science (Data Analytics), MSc in Computer Science (Artificial Intelligence), MSc in Computer Science (Artificial Intelligence) - Online
Module Code(s)		CT5120, CT5146
Module(s)		Introduction to Natural Language Processing, Introduction to Natural Language Processing - Online
Paper No.		1
External Examiner(s)		Dr John Woodward
Internal Examiner(s)		Dr. Michael Madden *Dr. John McCrae Dr Bharathi Raja Chakravarthi Dr Omnia Zayed

Instructions: Answer 4 sections out of 5; each section is worth 25 marks (100 marks total). **Use a separate answer book for each section answered.**

Duration	2 hours
No. of Pages	6
Discipline(s)	Computer Science
Course Co-ordinator(s)	Dr. Frank Glavin Dr. Matthias Nickles Dr. James McDermott

Requirements:

Release in Exam Venue	Yes	
MCQ		No
Handout	None	
Statistical/ Log Tables	None	
Cambridge Tables	None	
Graph Paper	None	
Log Graph Paper	None	
Other Materials	None	
Graphic material in colour		No

Introduction to Natural Language Processing

Exam Duration: 2 Hours

You must answer 4 of the following sections

Section 1: Text Classification

Question 1A

10 Marks

Explain what is meant by text classification and give **two** examples of tasks that may be solved by means of text classification

Question 1B

10 Marks

State the formula for TF-IDF.

Consider the following corpus, treating each sentence as a separate document

- You are called upon to deliberate on a new Constitution for the United States of America
- Yes, my countrymen, I own to you that, after having given it a thorough consideration, I am clearly of opinion it is in your interest to adopt it
- It is not a new observation that the people of any country seldom adopt and steadily persevere for many years in an erroneous opinion respecting their interests

Calculate TF-IDF vectors for each document containing the following words: a, constitution, country, it, you

Question 1C

5 Marks

Suggest a solution to the problem of out-of-vocabulary words in text classification

① Add one smoothing / PTO Laplace smoothing
→ Add 1 to every word count (of word in the vocab)
→ all the selected feature words are assumed to appear in all different class atleast once

② subword - feature engineering with n-grams
to break very rare pieces.

(1A) Text classification is to identify the class / intent of a sentence -

i. sentiment analysis (positive / negative)

ii. suggestion detection (yes / no)

$$(1B) \quad TF-IDF = \underset{\substack{(TF) \\ \text{in} \\ \text{curr. doc}}}{f_w} \times \left(\log \left(\frac{N}{N_w} \right) + 1 \right) \quad (IDF) \text{ in all doc}$$

$$q_1 = q_2 = q_3 = TF = 1, \quad \begin{matrix} N = 3 \\ N_w = 3 \end{matrix} = \log \frac{3}{3} + 1 = 1$$

$$\text{constitution}_1 = 1 \times \left(\log \frac{3}{1} + 1 \right) = 1.4771$$

$$\text{country}_3 = 1 \times \left(\log \frac{3}{1} + 1 \right) = 1.4771$$

$$it_2 = 3 \times \left(\log \frac{3}{4} + 1 \right) = 2.625$$

$$it_3 = 1 \times \left(\log \frac{3}{4} + 1 \right) = 0.8751$$

$$\text{you}_1 = 1 \times \left(\log \frac{2}{2} + 1 \right) = 1.1761$$

$$\text{you}_2 = 1.1761$$

2A

$$p(w_1 w_2 w_3 w_4) = p(w_4 | w_3) \times p(w_3 | w_2) \times p(w_2 | w_1) \times p(w_1)$$

Section 2: Sequence Models

Question 2A

5 Marks

State the formula for a bigram language model

Question 2B

10 Marks

it's raining it's pouring
the old man is snoring
he went to bed
and he bumped his head
and he couldn't get up in the morning.

For the above calculate all unigram and bigram probabilities. You should treat "it's" and "couldn't" as single tokens. Treat the whole corpus as a single sentence.

Question 2C

5 Marks

Using the probabilities calculated above, what is the probability of the sentence "And he went to bed"

$$= \frac{1}{3} \times \frac{1}{3} \times \frac{1}{3} \times \frac{1}{3} \times \frac{1}{3} = 0.027$$

Question 2D

5 Marks

The probability for the sentence "He went to bed in the morning" is zero. Suggest a modification to the bigram language model to produce a non-zero probability for this sentence.

PTO

↓
add one smoothing
↓
add assign non-zero probability to $p(\text{in}|\text{bed})$

$(\sum \beta)$

it's 2 (0.08) snoring 1 (0.04) his 1 (0.04)
 raining 1 (0.04) he 3 (0.12) head 1 (0.04)
 pouring 1 (0.04) went 1 (0.04) couldn't 1 (0.04)
 the 2 (0.08) to 1 (0.04) get 1 (0.04)
 old 1 (0.04) bed 1 (0.04) up 1 (0.04)
 man 1 (0.04) and 2 (0.08) in 1 (0.04)
 is 1 (0.04) bumped 1 (0.04) morning 1
 9 00 7 = 26

it's raining (1/2) is snoring 1 he bumped 1 (1/7)
 raining it's 1 snoring he 1 bumped his 1
 it's pouring (1/2) he went (1/3) his head 1
 pouring the 1 went to 1 head and 1
 the old 1 to bed 1 couldn't get 1
 old man 1 bed and 1 get up 1
 man is 1 and he 2 up in 1
 in the 1
 the morning 1

$$p(\text{raining} | \text{it's}) = \frac{p(\text{it's} | \text{raining})}{p(\text{it's} | \text{raining}) + p(\text{it's} | \text{not raining})}$$

Sum = 25

Section 3: Semantic Analysis

Question 3A

10 Marks

Define semantic analysis. List and explain at least three tasks that it entails.

Question 3B

5 Marks

Explain the steps involved in coreference resolution.

Question 3C

10 Marks

Consider the following text:

Joe Biden has announced Claire Cronin as his nominee for the position of US ambassador to Ireland. Cronin was a key campaigner for him in her home state of Massachusetts, where she was serving as the Majority Leader of the Massachusetts House of Representatives.

Apply the steps explained in 3B to resolve all coreferences in the given text.

PTO

mention detection =

mention clustering

- ① Joe Biden, the position of US ambassador, him, his
- ② Claire Cronin, nominee, Cronin, key campaigner, her, she, the majority leader of the Mass... House of Rep...

2A automatic methods for constructing unambiguous meaning representations for linguistic expression.

↳ i → **Lexical semantics** (word sense disambiguation)

↳ identify word meaning

ii → **compositional semantics** (semantic role labelling)

→ identify semantic role for each word / phrase

iii → **discourse semantics** (coreference resolution)

→ identify which words / phrases refer to the same 'entity' across sentence.

3B Step 1 → identify all mentions
↳ coreference candidates.
↳ (mention detection)

Step 2 → identify all mentions that refer to the same real world entity
↳ (mention clustering)

Section 4: Social Media Analysis

Question 4A

10 Marks

List and explain five different applications of NLP in social media.

Question 4B

10 Marks

List and explain three different task formulations of sentiment analysis. Give one example for each task.

Question 4C

5 Marks

What does suggestion mining involve? (List and briefly explain at least three sub-tasks)

PTO

Content
(4A) spam detection, offensive detection, misinformation detection, suggestion mining, sentiment analysis.

(4B) (1) Data Collection — collect data like tweets from social media via APIs.

(2) Data preprocessing — spelling checker, clean emojis.
— process data to prepare input for model training.

(3) Model selection — select a suitable classification model — supervised / unsupervised / etc.
— Binary classification / ordinal classification)

4C

suggestion classification

- yes/no

suggestion extraction

- span identification of the suggestion

suggestion aspect detection

- identify aspect of the suggestion

suggestions clustering

- aggregate similar suggestions etc.

Section 5: Information Extraction and Vector Space Models

Question 5A

10 Marks

Consider the following texts:

Doc 1: Government published NPHET advice

Doc 2: NPHET concerned about outbreaks in workplaces

Doc 3: NPHET advice says it is impossible to predict the trajectory of Covid-19

Create a Term-Document matrix (alphabetically sorted)

Question 5B

10 Marks

Explain what Inter-annotator agreement is and calculate Cohen's kappa for following annotation matrix

annotator A

		puppy	fried chicken
annotator B	puppy	6	3
	fried chicken	2	5

Question 5C

5 Marks

Calculate precision, recall and F1 for the following

Gold Standard items (GS) 40

Extracted items (EX) 60

Correctly extracted items (CEX) 20

END

$$TP + TN = 20$$
$$FP + FN = 40$$