



COMP-8730 Natural Language Processing & Understanding Winter 2024

#	Title	Due Date	Grade Release Date
3	Proposed Solution (Method)	Feb 25, AoE	March 04, AoE

This course is research-oriented and project-driven in which a research project should be defined and completed in the field of NLP within one semester. The objectives of the research project are to provide graduate students with:

- An experience with research procedure, in general, and research in NLP, in particular.
- Hands-on experience with NLP.
- Advancing state of the art in NLP while passing a grad course.
- An opportunity to present a research outcome at an international computer science conference
- An opportunity to meet with scholars in the NLP community

The research project proposes a solution(s) to a problem by implementing an algorithm like a software project. However, there are differences in some respects. For instance, while a software project may implement an existing algorithm, a research project should propose and implement a *new* algorithm that improves or addresses a particular aspect of a problem that the current algorithms overlook. Roughly, a research project has the following milestones (phases):

- 1) Proposal
- 2) Literature Review
- 3) Proposed Method (Formal + Code)
- 4) Experiment (Evaluation)
- 5) Presentation (Paper + Talk)

A manual is prepared to guide the students through each milestone in this course. The current manual is for the third milestone: Proposed Solution (aka Proposed Method), which further has the following steps:

Formal Definition: Input & Output (Solution)

At a very high abstract level, any proposed method to solve a problem can be defined as a function of inputs that does finite steps of processing and/or calculation on the inputs and results in a solution.

For instance, if your proposed method is to cluster people into groups of like-minded people, the input is a bunch of human individuals. The output is groups of people where each individual is a member of one group. This is the *informal* definition which is not exact, and a reader may have different interpretations such as:

- 1- Is it possible for a person to be a member of *multiple* groups?
- 2- What do you mean by *like-minded*?
- 3- What do you mean by a *bunch* of human individuals? Do you mean their information?
- 4- ...

To come up with the same interpretation for all readers, we use the language of logic and mathematics. We *formally* define the solution. We already did a similar step in the proposal for problem definition. Here is an example formal definition for the above solution:

Given a set of people $A = \{a_i\}_{i=1}^N$, our proposed solution is a function f such that f(A) outputs a partition on A that includes subsets of A such that each person $a_i \in A$ is a member of one and only one subset (group), and the union of all subsets (groups) is equal to A. Formally,

$$f: A \to P(A)$$

$$f(A) = \{C_j | C_j \subseteq A, |C_j| > 0, \forall C_j, C_{k \neq j} | C_i \cap C_j = \emptyset \}$$

Well, you may wonder it is difficult sometimes to formalize a method!

Formal Definition: Algorithm

So far, we only formally showed the input and outputs (solution). We have to proceed with more details about our method's processing steps on the input and how it outputs the final solution. Continuing on our example:

In our work, we represent each person $a_i \in A$ by the documents that she has published within a time period T. So, Given the set of all documents $D = \{d_{i,t}\}$, published by all persons in A, where $d_{i,t}$ is the document published by the person a_i at time t; $1 \le t \le T$, we calculate the similarity of a pair of person (a_i, a_j) by calculating the similarity of their documents as follows:

$$g(a_i, a_j) = \sum_{t=1}^{T} h(d_{i,t}, d_{j,t})$$

where h is a function that calculates the similarity of a pair of documents based on the number of words that are shared, i.e.,

$$h(d_1, d_2) = \frac{d_1 \cap d_2}{d_1 \cap d_2}$$

where d_i is a set of words in the document.

Are we done?! Not yet. We have not formalized how we group similar people. I leave it as an exercise for you!

Formal Definition: Pseudo-code

You can support your algorithm by pseudo-code that performs all the processing steps that you formalized like:

```
Algorithm 2 Finding regions of like-mindedness for time interval t (R_t)
          G_t, multigraph at time interval t;
          U, set of users;
           R_t, set of regions of like-mindedness for time interval t
          \text{find.r.t}(r = \mathbb{U} \times \varnothing, \mathcal{C} = [z_1, z_1, z_2, z_2, ..., z_{|\mathcal{Z}|}, z_{|\mathcal{Z}|}]);
 1: procedure find_\mathbf{r}_{-}\mathbf{t}(r = A \times B, C)

 if (r |= c) ∧ (∄r' ∈ R<sub>t</sub> : r ⊂ r') then

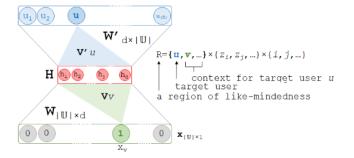
             \forall r'' \in \mathcal{R}_t \text{ if } r'' \subset r \text{ then } \mathcal{R}_t \leftarrow \mathcal{R}_t \setminus r''
              R_t \leftarrow R_t \cup r
       for all z_i \in \mathbb{Z} do
              A \leftarrow r.A; B \leftarrow r.B \cup z_i; C \leftarrow C \setminus z_i
             if r.B = \emptyset then find_r_t(A × B, C)
                  for all z_i \in r.B do
                         for all (z_i \rightarrow z_j) \in U_t do
                             A \leftarrow r.A \cap U_{z_i z_j,t}
11:
                              find_r_t(A \times B, C)
```

A pseudo-code is not precisely your program line by line in a specific programming language! It is, however, the overall flow of your program in a general abstract programming language. You should include the important parts of your code that are essential to provide the final solution.

Illustrative Figure

You can also support your algorithm through flow charts, data model diagrams, sequence diagrams, etc. Recall, in the undergrad course Software Engineering, you were taught how to document software. Here, we want to showcase our algorithm via a visual diagram. For instance,





Implementation (Code)

By implementation, aka code, we mean the program you wrote in a programming language and process the inputs and produce the final solution. Your code must follow the FAIR Guiding Principles¹, to improve the *findability*, *accessibility*, *interoperability* and *reusability* of digital research objects for both humans and *machines*! It simply says that anyone (a human or even a machine) can find your code and run it without error. So, your code should be:

- 1- Publically available online on repos like Github,
- 2- Must be runnable without error,
 - o Add a quickstart script to show a sample successful run
 - o Include git clone {your repo} in your script
 - o Include pip install -r requirement.txt setup an environment
 - o Include wget for public datasets if they're not in your repo
- 3- Aligned with what you formalize in your research paper, and does exactly the steps in your paper,
- 4- Include installation and/or running guides or ReadMe so that anybody can run your code.

Also, your code should be *reproducible* and *replicable*. There is a debate on the exact definition and their differences in the research community. Simply, your code should output the same (or similar) solutions when given the same inputs and using the same settings as you explained in your research paper. For instance, if in your paper you said that $if A = \{a_1, a_2, a_3\}$, then $f(A) = \{\{a_1, a_3\}, \{a_2\}\}$, when somebody downloads your code and run your code on $A = \{a_1, a_2, a_3\}$, she sees the same (or similar) result. Your algorithm may not be *deterministic* and involve some random procedures like machine learning methods that involve random steps. You need to seed the random process such that every run of the code using the same seed ends up with the same result!

```
import random
random.seed(0)
import torch
torch.manual_seed(0)
import numpy as np
np.random.seed(0)
```

In summary, Propose Solution has (%marking schema for this milestone):

- 1) (20%) Formal Definition
- 2) (10%) Pseudo-code
- 3) (10%) Illustrative Figure
- 4) (60%) Code (FAIR-compliant)

(20%) Architecture (Layers, Driver, ...)

(10%) Readme (Project Bio, Installation, Features, Licenese, ...)

(10%) Quickstart Script

(20%) Reproducible/Repeatable Results

¹ The FAIR Guiding Principles for scientific data management and stewardship: https://www.nature.com/articles/sdata201618

Submission Guidelines

- The implementations (code) should be available in an online repo (preferably Github), and the link should be mentioned as a footnote to the report's title. See the example below.
- Overleaf templates are available from the ACM Website (use the "sigconf" proceedings template).
- O Submission must be 2 pages (4 columns) in length, no more not less, including figures, tables, references, etc., authored by the team members. References should not be more than one column.
- O Submission must be in one single zip file Proposed Solution {firstname1} {firstname2}.zip, including:
 - 1. the LaTeX files
 - 2. the pdf file

A sample submission has been attached to this manual in Brightspace, also available online here.