





# The ClearEarth Project: Preliminary Findings from Experiments in Applying the CLEARTK NLP Pipeline and Annotation Tools Developed for Biomedicine to the Earth Sciences

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### What is ClearEarth?

ClearEarth is a collaborative project aimed at bringing semantic technologies from the biomedical field into the earth, ice and life sciences.

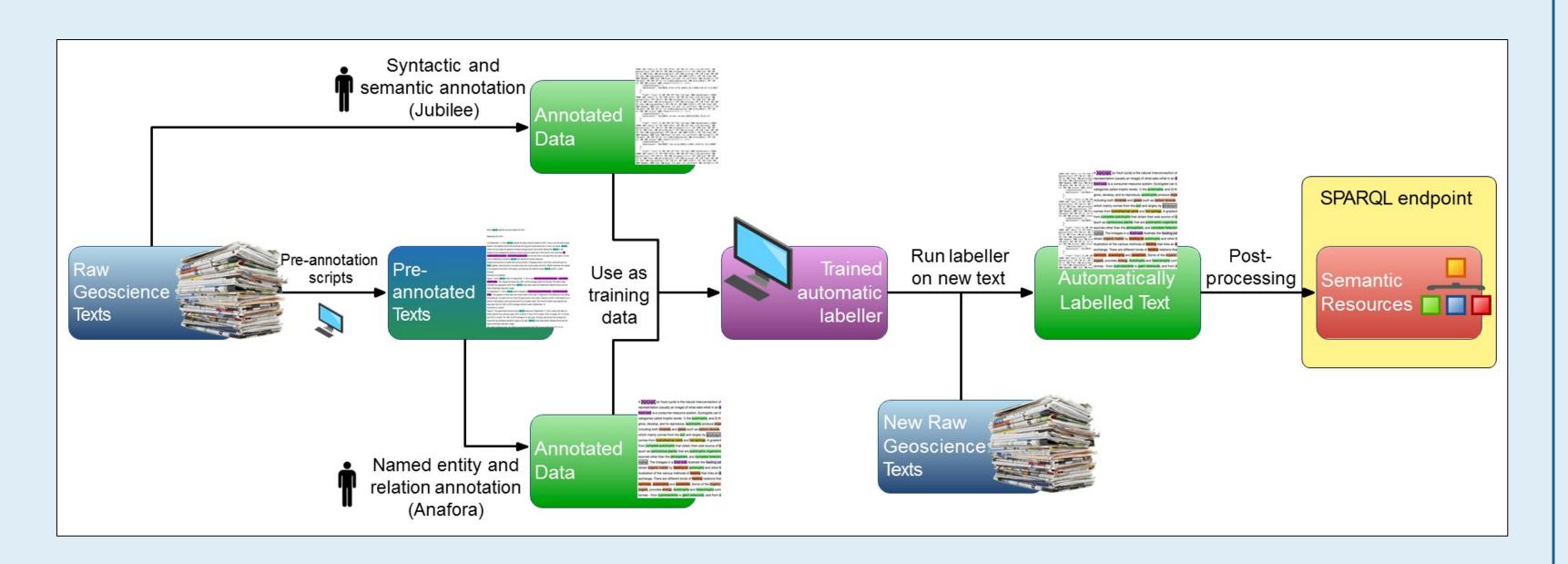
### Goals

Overall: Enable use of advanced industry and research software within the geo-, bio- and cryo-spheric sciences for downstream operations such as query and reasoning.

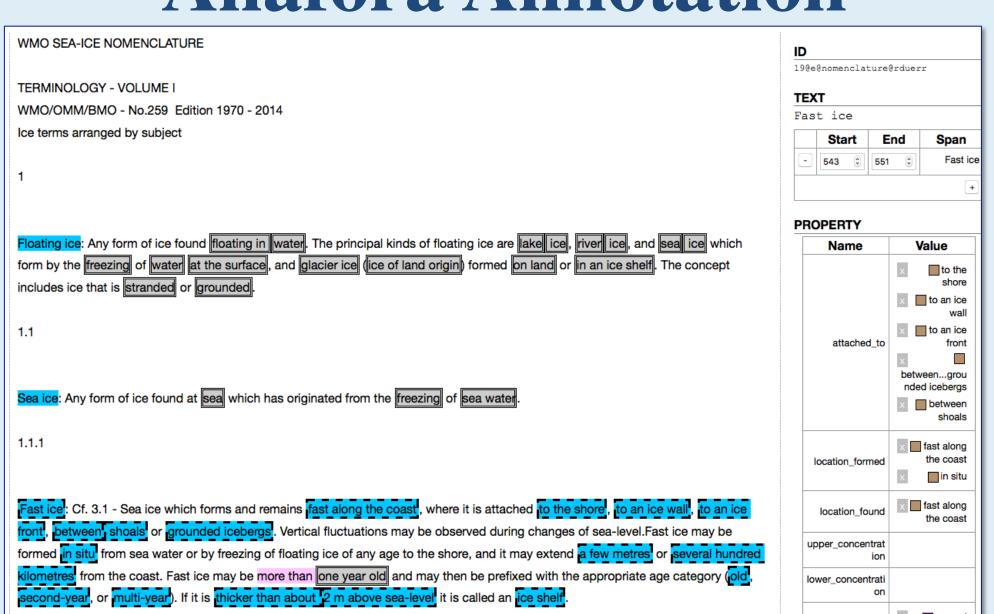
Year 2: 1) Develop efficient and accurate methods of annotating earth-icebiology texts with syntactic and semantic content. 2) Investigate pathways for successful adoption of the NLP and ML methods from the biomedical semantic technologies.

# **Updated Methods**

The most successful current approach for automatically extracting semantic content from text is by using supervised machine learning.



# **Anafora Annotation**



The annotation (Anafora) stage is extremely important. The Machine Learning (ML) software requires sufficiently large annotated corpus. Once a threshold is reached, virtually <u>all</u> texts in the domain are treatable by the ML-NLP methods.

### Outcomes

### Collaboration with IPA

The International Permafrost Association is working with the ClearEarth project to characterize the contents of their global permafrost database. They hope that characterization of the descriptions of each entry will enable them to improve discoverability of permafrost data, while meeting criteria as specified by users.

Collaboration with YAMZ

developers and domain scientists.

each definition tagged to its source.

wherever the terms are used.

**Glossaries Being Addressed** 

**Permafrost Glossary** 

Cryosphere Glossary

Sea ice nomenclature

**Biology Glossary** 

Glossary of Glacier Terminology

Glossary of Glacier Mass Balance and related terms

IACS International Classification for Seasonal Snow on the Ground

various domains represented in our project (see www.yamz.net).

YAMZ is a crowdsourced metadata dictionary we are using to add glossary terms from the

ClearEarth has scripts to convert the glossaries to a form which can be uploaded to YAMZ

Where multiple definitions exist in different glossaries, a single term will be created with

glossaries, to include them when developing domain specific semantic resources, and to

Next steps include asking the various communities to use these permalinks in their

Eventually one could imagine semantic markup in journal articles to the definitions

YAMZ assigns to each term a permanent URL that then can be used by ontology

Definitions from each glossary are tagged with a citation to their source.

This allows communities to see the differences and begin to resolve them

begin to resolve differences between glossary definitions where they exist.

- Associate standardized tags for Hydrology; Landform; Lithology; and Morphology fields.
- Based on the free text in these fields, determine and tag each record to improve the search process.
- The IPA community will vet these tags as they did manually, previously, for the vegetation category.

YAMZ Tag

#IACSSnow

**#USGSGlaciers** 

#IPAPermafrost

#WMOSealce

#ClearEarthBio

#NSIDCCryosphere

#IHPGlacierMassBalance

### Ideas for Speeding up the **Annotation Process**

Hypothesis: Using software to pre-annotate concepts, even multi-word expressions, from domain glossaries will speed up the annotation process. This allows us to use terms the community has already agreed upon to pre-annotate text before getting to Anafora. At that point annotators verify the preannotations and add additional annotations beyond the glossary content.

### Gold standard annotation guidelines

#### Rationale:

- The science community writes and thinks differently about domain specific texts than the general populace or even researchers in different domains.
- This limits the conceptual meanings that can be extracted from text using annotators who are not domain specialists
- Annotation guidelines are needed to teach non-domain specialist annotators what and how to annotate these texts **Outcome:**
- 'Gold standard' annotation guidelines were created for the cryo and bio domains.
- Creating "gold standards" ensures that the guidelines can be implemented by annotators who are not domain specialists while also ensuring their scientific rigor in the domain.
- Our metric for determining the efficacy of the guidelines is when inter-annotator agreement reaches at least 75%.
- The Sea Ice Guidelines have recently been baselined and will be added to the <a href="https://github.com/ClearEarthProject">https://github.com/ClearEarthProject</a> website

<sup>1</sup>Tim O'Gorman; Kristin Wright-Bettner; Martha Palmer, Richer Event Description: Integrating event coreference with temporal, causal and bridging annotation, Computing News Storylines Workshop, held

### **Annotation Lessons Learned**

#### **Annotation spans**

- When annotating text NLP experts tend to use either
  - minimum span or
  - maximum span
- Scientific concepts in glossaries are often phrases
- Worse yet, scientific texts often combine several such concepts into a single compound phrase where the ordering of the words may not be optimal
- ClearEarth agreed that if a phrase could be rephrased and partitioned into glossary concepts each component would be annotated

#### **Example mention of ice terms in the phrase** "... of thin Arctic first-year drift ice in late summer"

- "...of thin Arctic first-year drift ice in late summer
- "...of thin Arctic first-year drift ice in late summer
- Thin first-year ice is a term in the WMO sea ice nomenclature,
- So our "ice" mention becomes
- "...of thin Arctic first-year drift ice in late summer
- And "Arctic" is annotated as a location
- And "drift ice", another term in the WMO sea ice nomenclature, is annotated as an ice concentration

# Pushing Beyond the State of the Art

#### Dealing with complicated measurements

**Example:** Old ice is sea ice which has survived "at least one summer's melt"

The age of a type of sea ice is based on two factors:

- the number of summer's melts that it has survived
- 2. whether or not it is in a "new cycle of growth."
- **State of the art:** "one summer's melt"

would be annotated as: SeasonOfYear("summer",

Type=Summer, Number=Number("one", Value=1))

Which really translates to "every summer!!!" Not what is intended!

Pushing Beyond: Experimenting with JPL measurement extraction software

#### Dealing with complex chains of processes and subsidiary processes

**Example:** Shear [stress]CAUSE causes rocks to [[slide past each other]CAUSE]EFFECT resulting in an [earthquake]EVENT and strike-slip [faults]EFFECTS

State of the art & pushing beyond:

Tailoring RED<sup>1</sup> guidelines to these domains.

### **Dealing with negation**

**Example:** The base species in a food web are those **species without prey** ...

#### State of the art and pushing beyond:

- No straightforward solution
- Currently adding a "lack behavior" property for only the most important cases – address in future work

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