#### NLP-Based Mapping of Textbook Pathology to the Ontology for General Medical Science (OGMS)

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### **Project Goal**

Information about physiology and pathology exists primarily as natural language

- Some computable representations (e.g. FMA, SNoMed), but ...
  - Not connected
  - Not interoperable
  - Critical gaps in coverage

### **Project Goal**

- Develop the Human Pathology Network (HPN)
  - a computable representation of human pathology
  - Accommodates different disease types
  - Spans biological scales from molecules to clinical phenotypes
  - Connects pathological entities to their normal counterparts

- Ontology-driven NLP applied to "Robbins & Cotran Pathologic Basis of Disease"
  - Manual annotation
  - Active learning NLP
  - Ontology based representation of extracted information

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### Example

#### **Relevant Entities**

#### **Ontologies**

e.g. Foundational Model of Anatomy

portion of connective tissue regular connective tissue portion of extracellular matrix

is\_a has\_part

#### **Textual Description of Such Entities**

All tumors, benign and malignant, have two basic components:

- (1) clonal neoplastic cells that constitute their parenchyma and
- (2) reactive stroma made up of connective tissue, blood vessels, and variable numbers of macrophages and lymphocytes.

#### **Linguistic Resources**

e.g. FrameNet

- •Inclusion frame: A total has a part, either as a member of an aggregate or as a constituent part of a simple entity.
  - •Frame elements: part, total
  - •Lexical units: contain (verb), exclude (verb), excluding (preposition), have (verb), include (verb), including (preposition), inclusive (adjective), incorporate (verb), integrated (adjective)

#### Manual Annotation

All tumors, benign and malignant, have two basic components:(1) clonal neoplastic cells that constitute their parenchyma and (2) reactive stroma made up of connective tissue, blood vessels, and variable numbers of macrophages and lymphocytes.

Term from Text		Ontology Term
FMA	parenchyma stroma connective tissue blood vessel	parenchyma stroma portion of connective tissue vein
CL	macrophage lymphocyte	macrophage lymphocyte
NCIT	tumor benign malignant neoplastic cell	neoplasm benign neoplasm malignant neoplasm neoplastic cell

#### Manual Annotation

All <u>tumors</u>, <u>benign</u> and <u>malignant</u>, <u>have</u> two basic components:(1) <u>clonal neoplastic</u> <u>cells</u> that <u>constitute</u> their <u>parenchyma</u> and (2) <u>reactive stroma made up of connective</u> <u>tissue</u>, <u>blood vessels</u>, and variable numbers of <u>macrophages</u> and <u>lymphocytes</u>.

has\_part part\_of

#### Manual Annotation

[[AII]QUANTIFIER tumors]PART-OF\_FRAME(1):FE=WHOLE, benign and malignant, have [[two]CARDINAL-1 basic components]PART-OF\_FRAME (1):LU: [(1)ORDINAL@CARDINAL-1 clonal neoplastic cells that constitute their [parenchyma]PART-OF\_FRAME(1):FE=PART] and [(2) ORDINAL@CARDINAL-1 [reactive stroma]PART-OF\_FRAME(1):FE=PART] made up of connective tissue, blood vessels, and variable numbers of macrophages and lymphocytes.

- •Inclusion frame: A total has a part, either as a member of an aggregate or as a constituent part of a simple entity.
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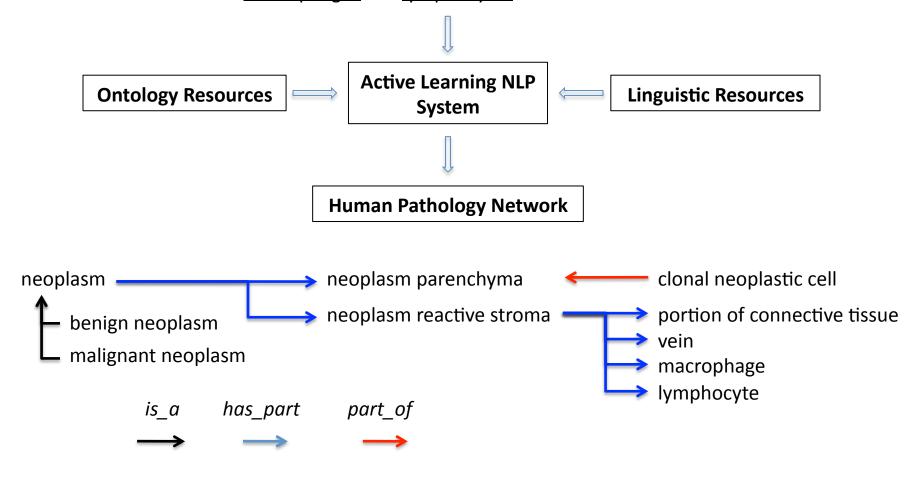
#### **Active Learning NLP**

- Annotations (ours, Genia Corpus, ...)
- AL guides the annotation process
  - Selection
  - Presentation
  - Validation or correction
  - Incremental training
- Selection based on informativeness
- Machine learning methods
  - Developed by UTD team for the i2b2 2010 and 2011

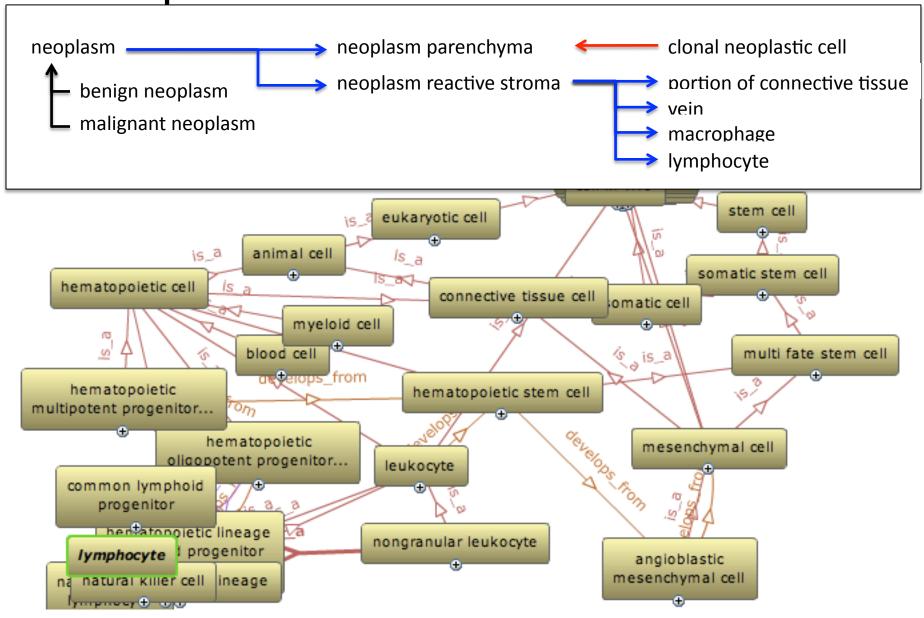
#### Representation of Extracted Text

#### **Robbins Pathology**

All <u>tumors</u>, <u>benign</u> and <u>malignant</u>, <u>have two basic components</u>:(1) <u>clonal neoplastic cells</u> that <u>constitute</u> their <u>parenchyma</u> and (2) <u>reactive stroma</u> <u>made up of connective tissue</u>, <u>blood vessels</u>, and variable numbers of <u>macrophages</u> and <u>lymphocytes</u>.



#### Representation of Extracted Text



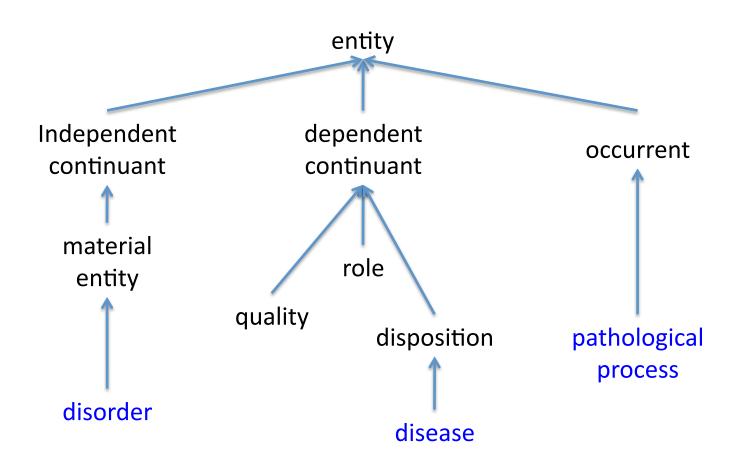
#### Creation of Ontology Resources

- Pathology Foundational Ontology (PFO)
- Biomedical Relation Ontology (BRO)

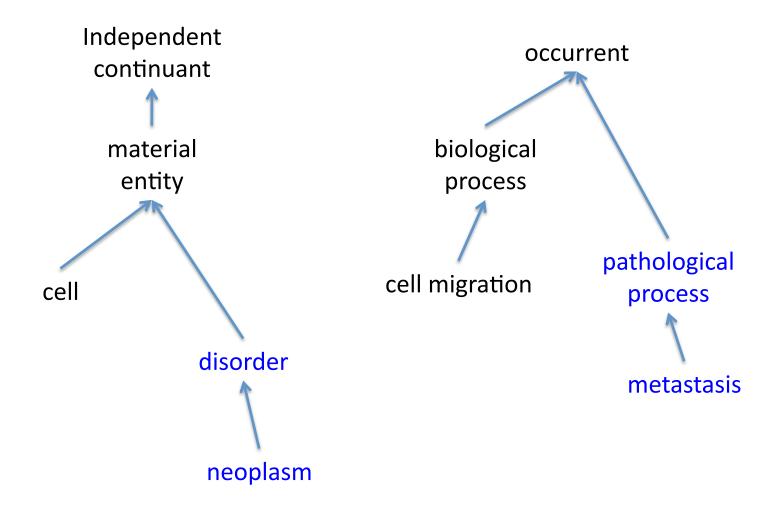
#### **PFO**

- Developed within the OBO Foundry framework
  - Utilize the Basic Formal Ontology
  - Use existing ontologies where possible
    - Emphasize OBOF ontologies
    - Import terms via MIREOT (Courtot et al 2010)
- Expand iteratively as encounter terms for annotation
- Challenge: integrating terms from clinical terminologies and ontologies

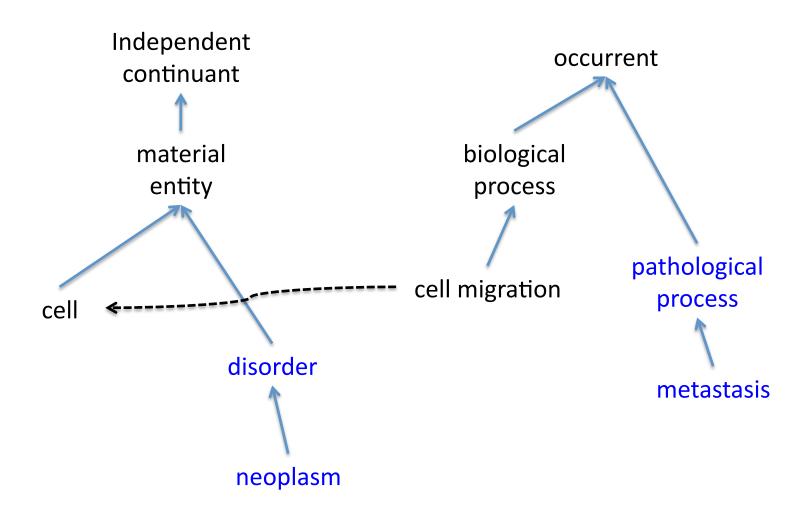
#### BFO and OGMS



#### **PFO**



#### **PFO**



#### Development of BRO

- Text analysis to identify core set of relations
- Map to RO where possible.
- Of the remaining relations, determine which are foundational and which are domain-specific.
- Develop formal, first order logic definitions for new relations
  - Define in terms of existing RO relations
  - Define domain-specific relations in terms of foundational relations
- Provide a representation for each relation as an OWL object property.

#### **Current Work**

- Cellular Responses to Stress and Toxic Insults:
  Adaptation, Injury, and Death
- Infectious Diseases
- Neoplasia
- The Heart
- The Lung
- Diseases of the Immune System

### Initial survey

- Initial survey of the text showed reference to a relatively small number of relations
  - (We assume that is due to the fact that the text stems from a textbook)
- A large number of relations are in accordance with OBO RO.

# Relations annotated in the first 2 subsections:

has_integral_part*	causes	is_integral_part_of*
adjacent_to*	contained_in*	disorder_leads_to_disease
promotes	realizes	transmitted_by
is_a	depends_on	unfolds_in
bearer_of	infects	aggregates_to
larger_than		

<sup>\*</sup> Relations represented by RO release version 1.01

## Challenges

- Scale
  - Protégé, OWL reasoners, ...
- Inter-annotator consistency

#### Interesting Questions

- At what level of specificity should we annotate?
  - Do we annotate 'lymphocyte' with the CL term 'lymphocyte' or 'cell'?
- In what ways can the ontology relations be used to improve NLP?

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