# Developing a Uniform Meaning Representation for Natural Language Processing

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#### **Outline**

- Background
  - Do we need a new meaning representation?
  - What makes UMR desirable?
- Aspects of Uniform Meaning Representation (UMR)
  - Formal properties of UMR
  - Cross-lingual applicability separating the language-independent from the language-specific
  - Document-level vs. sentence-level representation
  - UMR-Writer annotation tool
- Discussion:
  - ► Are symbolic representations of meaning still needed?
  - Use cases for UMR

#### Do we need a new meaning representation?

- Existing meaning representations vary a great deal in their focus and perspective
  - Formal semantic representations for logical inference (e.g. MRS, DRT) focus on the proper representation of:
    - quantification
    - negation
    - tense
    - modality
  - Lexical semantic representations (e.g. TR, AMR) focus on the proper representation of:
    - core predicate-argument structures
    - word senses
    - named entities
    - co-reference

#### Do we need a new meaning representation?

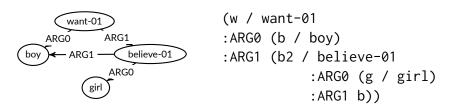
- Existing meaning representations vary a great deal in the "semantic vocabulary" they use:
  - One extreme: no classification of named entities at all (MRS)
  - Other extreme: over 100 types of named entities (AMR)
- Existing meaning representations are often developed based on English / high-resource languages
  - ► Their structures and workflows therefore pose challenges for the annotation of typologically different languages

#### In comes UMR

- UMR (Uniform Meaning Representation) is an NSF-funded collaborative project between Brandeis University, University of Colorado, and University of New Mexico
- Our starting point is AMR, which has a number of attractive properties:
  - Easy to read
  - Scalable (does not rely on syntactic structures)
  - Information that is important to downstream applications (e.g., semantic roles, named entities and coreference)
  - Well-defined mathematical structure (single-rooted, directed, acylical graph)
- UMR augments AMR with meaning components that are missing and adapts it to cross-lingual settings

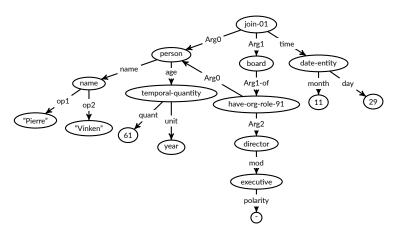
#### The starting point: AMR

- Single-rooted, directed, acylic graph
- Nodes are concepts (sense-disambiguated predicates, named entity types, plain lemmas)
- Edges are relations (participant roles, other semantic relations)

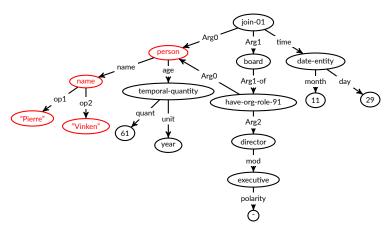


"The boy wants the girl to believe him." Banarescu et al. (2013)

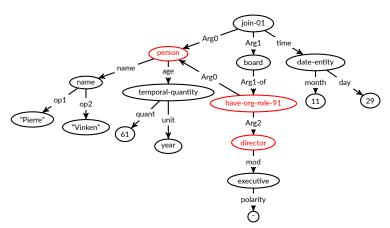
#### The starting point: AMR



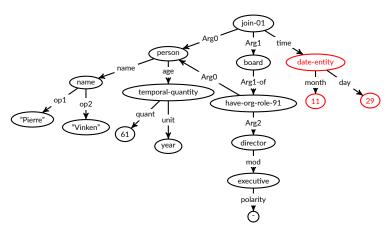
#### **AMR: Named Entities**



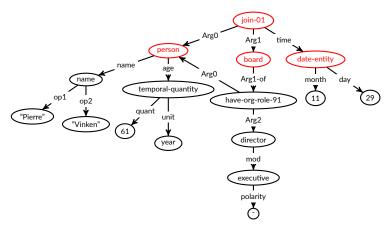
#### **AMR: Relations**



#### **AMR: Date entities**



#### AMR: Word sense and semantic roles



#### From AMR to UMR (Van Gysel et al., 2021)

- ▶ To make UMR cross-linguistically applicable, it:
  - defines a set of language-independent abstract concepts and participant roles,
  - uses lattices to accommodate linguistic variability,
  - provides meaning-based guidelines for the identification of events,
  - designs specifications for complicated mappings between words and UMR concepts,
  - is organized as a road map so that languages at different stages of documentation and description can use UMR at an appropriate level of detail.

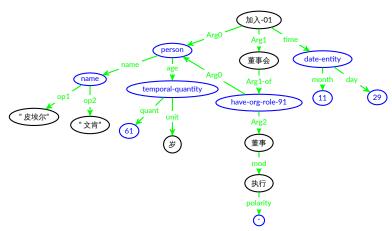
#### From AMR to UMR (Van Gysel et al., 2021)

- At the sentence level, UMR adds:
  - ► An Aspect attribute to eventive concepts
  - Person and Number attributes for pronouns and other nominal expressions
  - A principled set of discourse relations
  - Quantification scope between quantified expressions
- At the document level UMR adds:
  - ► Temporal dependencies in lieu of tense
  - Modal dependencies in lieu of modality
  - ► Coreference relations beyond sentence boundaries

## UMR is a cross-lingual meaning representation

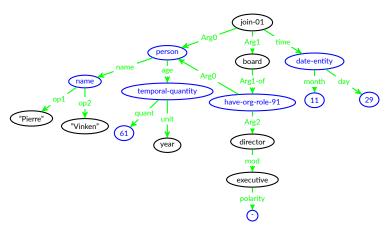
- ► Abstract concepts (e.g., person, thing, have-org-role-91) are uniform across languages
  - Concepts that do not always have explicit lexical support but can be inferred from context
- ▶ UMR defines a set of general participant roles (e.g., agent, theme, causer) and non-participant relations that are uniform across languages
- ▶ But UMR is still not an Interlingua:
  - ► Lexical concepts include sense-disambiguated lemmas or simple lemmas and are language-specific (e.g., Mandarin 加入.01 vs. English join-01 vs. Sanapaná empahlkay'a)
  - ► Languages can define their own lexicalized participant roles (e.g., :ARGO of 加入.01)
- In general, grammatical meaning is language-independent while lexical meaning is language-specific

## Language-independent vs language-specific aspects



"61 岁的 Pierre Vinken 将于 11 月 29 日加入董事会,担任非执行董事。"

## Language-independent vs language-specific aspects



## Abstract concepts in UMR

- Abstract concepts inherited from AMR:
  - Standardization of quantities, dates etc.: have-name-91, have-frequency-91, have-quant-91, temporal-quantity, date-entity...
- New concepts for abstract events: "non-verbal" predication.
- New concepts for abstract entities: entity types are annotated for named entities and implicit arguments.
- Scope: scope concept to disambiguate scope ambiguity to facilitate translation of UMR to logical expressions (see sentence-level structure).
- ▶ Discourse relations: concepts to capture sentence-internal discourse relations (see sentence-level structure).

# Where do we find abstract eventive concepts?

#### Semantic type and information packaging (Croft 2001):

	Reference	Modification	Predication
Entities	UNMARKED	relative	predicate
	NOUNS	clauses, PPs	nominals,
		on nouns	complements
States	deadjectival	UNMARKED	predicate
	nouns	ADJECTIVES	adjectives,
			complements
Processes	event nom-	participles, rel-	UNMARKED
	inals, com-	ative clauses	VERBS
	plements,		
infinitives,			
	gerunds		

#### Where do we find abstract eventive concepts?

- Sentence-level information packaging is not always predicational:
  - ► I have a book "thetic", "all-new", "presentational"
  - The book belongs to me "predicative", possessee is known information
- ► AMR does not distinguish these meanings, UMR does only in typically "non-verbal" contexts:
  - Possession
  - Location
  - Object/Property predication

#### Where do we find abstract eventive concepts?

- Languages use different strategies to express these meanings:
  - Overt copula: English I have a book
  - Juxtaposition: Tiwi ngawa mantani teraka 'Our friend has a wallaby, lit. [As for] our friend, wallaby.'
  - Predicativized possessum: Yukaghir pulundie jowjen'i 'The old man has a net, lit. The old man net-has.'
- UMR assumes annotators are able to recognize the semantics of these constructions and select the appropriate abstract predicate and its participant roles
- UMR does not require alignment between concepts and words

# Sample abstract events

Clause type	Predicate	ARG0	ARG1
thetic pos- session	have-03	possessor	possessum
predicative possession	belong-01	possessum	possessor
thetic loca- tion	exist-91	location	theme
predicative location	have-location- 91	theme	location
property predication	have-mod-91	theme	property
object predication	have-role-91	theme	object cate- gory
equational	identity-91	theme	equated refer- ent

## Example abstract events

#### Named entities

Туре	Subtype (AMR NE Type)
	person, family, animal, language, nationality, ethnic-group,
	regional-group, religious-group, political-movement
Organization	commerical-org (company), political-org (political-party), government-org (government-organization), military-org (military), criminal-org (criminal-organization), academic-org (school, university, research-institute), sports-org (team, league), market-sector
Geographic-entity	ocean, sea, lake, river, gulf, bay, strait, canal, peninsula,
	mountain, volcano, valley, canyon, island, desert, forest
Celestial-body	moon, planet, star, constellation region local-region, country-region, world-region GPE city, city-district, county,
	state, province, territory, country
facility	airport, station, port, tunnel, bridge, road, railway-line, canal, building, theater, museum, palace, hotel, worship-place, market, sports-facility, park, zoo, amusement-park
event	incident, natural-disaster, earthquake, war, conference, game, festival
product	vehicle, ship, aircraft, aircraft-type, spaceship, car-make, work-of-art, picture, music, show, broadcast-program
publication	book, newspaper, magazine, journal

# Language-independent vs language-specific participant roles

- Core participant roles are defined in a set of frame files (valency lexicon). The semantic roles for each sense of a predicate are defined:
  - E.g. boil-01: apply heat to water ARG0-PAG: applier of heat ARG1-PPT: water
- Most languages do not have frame files. UMR defines language-independent participant roles
  - Based on ValPal data on co-expression patterns of different micro-roles (Hartmann et al., 2013)

#### Language-independent roles: An incomplete list

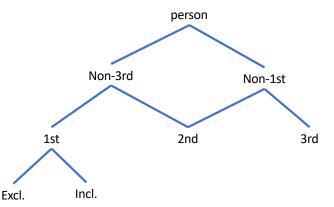
<b>UMR</b> Annotation	Definition
Actor	Animate entity that initiates the action
Undergoer	Entity (animate or inanimate) affected by the action
Theme	Entity (animate or inanimate) moving from one entity to another, spatially or metaphorically
Recipient	Animate entity that gains possession (or at least temporary control) of another entity
Force	Inanimate entity that initiates the action
Causer	Animate entity that acts on another animate entity to initiate the action
Experiencer	Animate entity that cognitively or sensorily experiences a stimulus
Stimulus	Entity (animate or inanimate) that is experienced by an experiencer

## How UMR accommodates cross-linguistic variability

- Not all languages grammaticalize/overtly express the same meaning contrasts:
  - ► English: I (1SG) vs. you (2SG) vs. she/he (3SG
  - Sanapaná: as- (1SG) vs. an-/ap- (2/3SG)
- However, there are typological patterns in how semantic domains get subdivided:
  - A 1/3SG person category would be much more surprising than a 2/3SG one
- ► UMR uses lattices for abstract concepts and relations to accommodate variability across languages.
  - Languages with grammatical distinctions can choose to use more fine-grained categories

#### Lattices

- Semantic categories are organized in "lattices" to achieve cross-lingual compatibility while accommodating variability.
  - Lattices for Aspect, Modal Strength, Person, Number,
     Discourse Relations, Modification Relations



## Wordhood vs concepthood across languages

- ► The mapping between words and concepts in languages is not one-to-one: UMR designs specifications for complicated mappings between words and concepts.
  - Multiple words can map to one concept (e.g., multi-word expressions)
  - One word can map to multiple concepts (morphological complexity)

## Multiple words map to one concepts

 UMR is working on consistent standards for annotating MWEs cross-linguistically

```
(i / intrigue-01 (x0/敲竹杠-01
:Aspect Performance :arg0 (x1/他)
:ARG0 (a / aspect :arg1 (x2/人
:ARG1-of (m / moral-02) :mod (x3/老)
:poss (m2 / movement-07)) :mod (x4/可怜)
:ARG1 (h / he) :mod (x5/那)
:mod (a2 / as-well)) :cunit (x6/□)))
```

The moral aspects of the movement intrigued him <u>as well</u>

对那个可怜的老人,他还 <u>敲竹杠</u>。

## Concepts can map to words that are discontinuous

(x0/□忙-01 :aspect Performance :arg0 (x1/地理□) :beneficiary (x2/我) :degree (x3/大)) 地理学<u>帮</u>了我很大的<u>忙</u>。

:ARG0 (p / person)
:ref-person 3r
:ref-number si
:ARG1 (g / give-up-07
:ARG0 h
:ARG1 (t / that))
:ARG1-of (c / cause-01

:ARG0 (a / amr-ur

(w / want-01

"Why would he want to give that up?"

#### One word maps to multiple UMR concepts

One word containing predicate and arguments

#### Arapaho:

 Argument Indexation: Identify both predicate concept and argument concept, don't morphologically decompose word

#### **UMR** sentence-level additions

- An aspect attribute to eventive concepts
  - Aspect refers to the internal constituency of events, and indicates whether it is on-going or completed
- Person and number attributes for pronouns and other nominal expressions
- Quantification scope between quantified expressions to facilitate translation of UMR to logical expressions

#### **Aspect**

- Process: unspecified type of process
- ► State: unspecified type of state
  - reversible state: acquired state that is not permanent
  - irreversible state: acquired state that is permanent
  - inherent state: state that is not acquired and permanent
  - point state: state that is acquired and reversed at a single point in time
- Habitual: an event that occurs regularly in the past or present.
- Activity: an event has not necessarily ended and may be ongoing at Document Creation Time (DCT).
- Endeavor: used for processes that end without reaching completion (i.e., termination)
- Performance: used for processes that reach a completed result state.

## UMR attribute: aspect

```
He denied any wrongdoing.
(d / deny-01
  :Aspect Performance
  :ARG0 (p / person)
           :ref-person 3rd
           :ref-number Singular
  :ARG1 (t / thing
           :ARG1-of (d2 / do-02
                        :ARG0 h
                        :ARG1-of (w / wrong-02))))
```

## Coarse-grained Aspect as an UMR attribute

He wants to travel to Albuquerque.

```
(w / want
  Aspect: state)
```

She rides her bike to work.

```
(r / ride
  Aspect: habitual)
```

He was writing his paper yesterday.

```
(w / write
  Aspect: activity)
```

Mary mowed the lawn for thirty minutes.

```
(m / mow
   Aspect: endeavor)
```

#### Fine-grained Aspect as an UMR attribute

My cat is hungry.

(h / have-mod-91
 Aspect: reversible state)

The wine glass is shattered.

(h / have-mod-91
 Aspect: irreversible state)

My cat is black and white.

(h / have-mod-91
 Aspect: inherent state)

It is 2:30pm.

(h / have-mod-91
 Aspect: point state)

## AMR vs UMR on how pronouns are represented

▶ In AMR, pronouns are treated as unanalyzable concepts, but pronouns differ from language to language, so in UMR they are decomposed into person and number attributes.

#### UMR attributes: Person and number

▶ Person and number attributes are not limited to pronouns

Bill saw rare birds today.

#### UMR attributes: Person and number

 Person and number can be applied uniformly across languages

```
(e / entoma-00 'eat'
   :Actor (p / person
             :ref-person 3rd
             :ref-number Plural)
   :Undergoer (t / thing
                 :ref-number Singular)
   :aspect Performance
   :polarity -)
m-e-hl-t-om-o=hlta
NEG-2/3M.IRR-DSTR-eat-PST/HAB-SBJ=PHOD
"They did not eat it."
```

# Disambiguation of quantification scope in UMR

```
"Someone didn't answer all the questions"

(a / answer-01
    :ARG0 (p / person)
    :ARG1 (q / question :quant All :polarity -)
    :pred-of (s / scope :ARG0 p :ARG1 q))

\exists p(\text{person}(p) \land \neg \forall q(\text{question}(q) \rightarrow \exists a(\text{answer-01}(a) \land \text{ARG1}(a,q) \land \text{ARG0}(a,p))))
```

## **UMR** document-level representation

- Temporal relations are added to UMR graphs as temporal dependencies
- Modal relations are also added to UMR graphs as modal dependencies
- Coreference is added to UMR graph as identity or subset relations between named entities or events.

## No representation of tense in AMR

```
talk-01
                     (t / talk-01
           medium
   ARG0
                          :ARG0 (s / she)
       ARG2
               language
she
                          :ARG2 (h / he)
                 name
        he
                          :medium (1 / language
                 name
                                          :name (n / name
                 op1
                                                  :op1 "French"))
                "French"
```

- "She talked to him in French."
- "She is talking to him in French."
- "She will talk to him in French."

# Adding tense is seemingly straightforward

Adding tense to AMR involves essentially defining a temporal relation between the time of the event and the Document Creation Time (DCT) or speech time (Donatelli et al 2019).

```
(t / talk-01
      talk-01
                         :time (b / before
          medium
  ARG0
      /ARG2
                                    :op1 (n / now)))
               language
                         :ARG0 (s / she)
                name
       he
                         :ARG2 (h / he)
                name
before
                         :medium (1 / language
                op1
op1
                                        :name (n / name
               "French"
                                                 :op1 "French")))
```

"She talked to him in French."

## Limitations of simply adding tense

- For some events, its temporal relation to the DCT or speech time is undefined. "John said he would go to the florist shop".
  - Is "going to the florist shop" before or after the DCT?
  - Its temporal relation is more naturally defined with respect to "said".
- ▶ In quoted speech, the speech time has shifted. "I visited my aunt on the weekend," Tom said.
  - ► The reference time for "visited" has shifted to the time when Tom said this. We only know the "visiting" event happened before the DCT indirectly.
- Tense is not universally grammaticalized, e.g., Chinese

## Limitations of simply adding tense

- Even in cases when tense, i.e., the temporal relation between an event and the DCT is clear, tense may not give us the most precise temporal location of the event.
  - ▶ John went into the florist shop.
  - He had promised Mary some flowers.
  - ► He **picked out** three red roses, two white ones and one pale pink
  - Example from (Webber 1988)
- ▶ All three events happened in the past, i.e., before the DCT, but we also know that the "going" event happened after the "promising" event, but before the "picking out" event.

## A structured approach to temporal interpretation

So it seems that we can't properly interpret the temporal relations without a clear notion of *reference time*. So in the UMR framework, we propose to:

- Explicitly represent the temporal location of an event as a relation between the event and its reference time
- ▶ In addition to the speech time or DCT, possible reference times also include other events, time expressions, or a general past, present, or future reference
- ► The events and their reference times in a text will form a dependency graph where the nodes are events and time expressions and the edges are temporal relations

Zhang and Xue (2018); Yao et al. (2020)

### Identifying reference times for events

- Reference time is the DCT
  - ► The Pentagon <u>said</u> today that it will <u>re-examine</u> the question.
  - DCT → re-examine
  - ► The Pentagon <u>said</u> <u>today</u> that it would <u>re-examine</u> the question.
  - ▶ said → re-examine

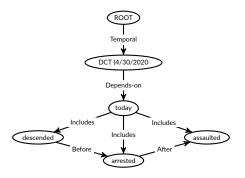
### Identifying reference times for events

- ▶ The reference time of an event is another event.
  - ▶ John went into the florist shop. He had promised Mary some flowers. He picked out three red roses, two white ones and one pale pink
  - ightharpoonup went ightharpoonup had promised
  - ightharpoonup went ightharpoonup picked out



## Temporal dependency Structure (TDS)

If we identify a reference time for every event and time expression in a document, the result will be a Temporal Dependency Graph.



"700 people <u>descended</u> on the state Capitol <u>today</u>, according to Michigan State Police. State Police made one <u>arrest</u>, where one protester had assaulted another, Lt. Brian Oleksyk said."

## Modality in AMR

- Modality characterizes the reality status of events, without which the meaning representation of a text is incomplete
- AMR has six concepts that represents modality:
  - possible-01, e.g., "The boy can go."
  - obligate-01, e.g., "The boy must go."
  - permit-01, e.g., "The boy may go."
  - recommend-01, e.g., "The boy should go."
  - likely-01, e.g., "The boy is likely to go."
  - prefer-01, e.g., "They boy would rather go."
- The modality in AMR is represented as senses of an English verb or adjective.
- However, the same exact concepts for modality may not apply to other languages

## The interaction of modality and polarity

When assessing that reality status of a statement, it is often necessary consider the interaction between modality and polarity (Vigus et al 2019):

Label Value Example AFF full affirmative The dog barked PARTAFF partial affirmative The dog probably barked NEUTFF neutral affirmative The dog might have barked NEUTNEG neutral negative The dog might not have barked PARTNEG partial negative The dog probably didn't bark The did not bark NFG full negative

#### Modal Source or Conceiver

- ▶ In order to assess the validity or factuality of a statement, we also need to take into consideration the credibility of the source (Vigus et al 2019).
  - "Mary might have walked the dog". It is the author's belief that it is possible that Mary has walked the dog.
- ▶ The modal source or conceiver can be nested:
  - "Mary said that Henry told her that John thinks the cat is hungry."
- ➤ To assess if the cat is really hungry or not, the credibility of each one of sources will affect the outcome.

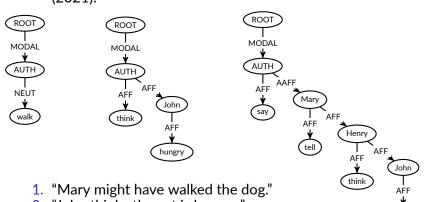
# Why is source important to factuality assessment

"WBUR: A man in his 20s from Worcester County tested positive Tuesday for the new, apparently more contagious coronavirus variant, <u>public health officials</u> said. The variant was first detected in the United Kingdom, and <u>experts</u> have warned that it could soon become widespread in the U.S."

Is the event "testing positive" as credible if it comes from your neighbor?

## A structured representation of modality and polarity

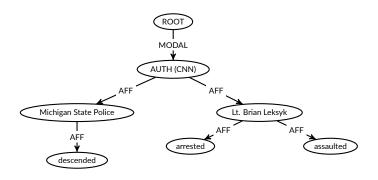
We can use a dependency structure to model the nestedness of modal source Vigus et al. (2019); Yao et al. (2021):



hungry

- 2. "John thinks the cat is hungry."
- 3. "Mary said that Henry told her that John thinks the cat is hungry."

# Modal dependency structure (MDS)



"700 people <u>descended</u> on the state Capitol today, according to <u>Michigan State Police</u>. State Police made one <u>arrest</u>, where one protester had <u>assaulted</u> another, Lt. Brian Oleksyk said."

### **Entity Coreference in UMR**

- Entity coreference
  - same-entity:
    - 1. Edmund Pope tasted freedom today for the first time in more than eight months.
    - 2. He denied any wrongdoing.
  - subset:
    - 1. <u>He</u> is very possesive and controlling but he has no right to be as we are not together.
- Event coreference

#### Event coreference in UMR

- same-event
  - 1. El-Shater and Malek's property was <u>confiscated</u> and is believed to be worth millions of dollars.
  - 2. Abdel-Maksoud stated the <u>confiscation</u> will affect the Brotherhood's financial bases.
- same-event
  - 1. The Three Gorges project on the Yangtze River has recently introduced the first foreign capital.
  - 2. The loan, a sum of 12.5 million US dollars, is an export credit <u>provided</u> to the Three Gorges project by the Canadian government, which will be used mainly for the management system of the Three Gorges project.
- subset:
  - 1. 1 <u>arrest</u> took place in the Netherlands and another in Germany.
  - 2. The <u>arrests</u> were ordered by anti-terrorism judge fragnoli.

### An UMR example with coreference

<u>He</u> is controlling but he has no right to be as <u>we</u> are not together.

```
(s4c / contrast-01
      :ARG1 (s4c3 / control-01
                  :ARG0 (s4p2 / person
                            :ref-person 3rd
                             :ref-number Singular)
                  :degree (s4v / very)))
      :ARG2 (s4r / right-05 :polarity -
            :ARG1 s4p2
            :ARG1-of (s4c2 / cause-01
                        :ARG0 (s4t / together
                                 :Aspect State
                                 :domain (s4p3 / person
                                             :ref-person 1st
                                             :ref-number Plural)))))
(s / sentence
 :coref ((s4p2 :subset-of s4p3)))
```

## Implicit arguments

 Implicit arguments can be inferred from context and can be annotated for coreference like overt (pronominal) expressions

"He denied any wrongdoing."

# The challenge: Integration of different meaning components into one graph

- ► How do we represent all this information in a unified structure that is still easy to read and scalable?
- ► UMR pairs a **sentence-level** representation (a modified form of AMR) with a **document-level** representation.
- We assume that a text will still have to be processed sentence by sentence, so each sentence will have a fragment of the document-level super-structure.

## Integrated UMR representation

- 1. Edmund Pope **tasted** freedom today for the first time in more than eight months.
- Pope is the American businessman who was convicted last week on spying charges and sentenced to 20 years in a Russian prison.
- 3. He **denied** any wrongdoing.

# Sentence-level representation vs document-level representation

Edmund Pope **tasted** freedom today for the first time in more than eight months.

```
(s1t2 / taste-01
                                                 (s1 / sentence
     :Aspect Performance
                                                    :temporal ((s1t2 :before DCT)
     :ARG0 (s1p / person
                                                               (s1t3 :depends-on DCT))
                 :name (s1n2 / name
                                                    :modal ((s1t2 :AFF AUTH)))
                              :op1 "Edmund"
                              :op2 "Pope"))
     :ARG1 (s1f / free-04 :ARG1 s1p)
     :time (s1t3 / today)
     :ord (s1o3 / ordinal-entity
                :value 1
                :range (s1m / more-than
                            :op1 (s1t / temporal-quantity
                                 :quant 8
                                 :unit (s1m2 / month)))))
```

# Sentence-level representation vs document-level representation

Pope is the American businessman who was convicted last week on spying charges and sentenced to 20 years in a Russian prison.

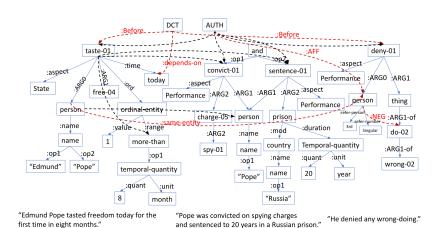
```
(s2b2 / businessman
                                                               (s2 / sentence
      :Aspect State
                                                                   :temporal ((s2c4 :before s1t2)
     :mod (s2c5 / country
                                                                             (s2s : after s2c4))
                 :name (s2n6 / name :op1 "America"))
                                                                   :modal ( (s2c4 :AFF AUTH)
     :domain (s2p / person
                                                                           (s2s:AFF AUTH))
                   :name (s2n5 / name :op1 "Pope"))
      :ARG1-of (s2c4 / convict-01
                     :Aspect Performance
                     :ARG2 (c / charge-05
                               :ARG1 s2b2
                               :ARG2 (s2s2 / spy-01 :ARG0 s2p))
                     :time (s2w / week :mod (s2l / last)))
     :ARG1-of (s2s / sentence-01
                    :Aspect Performance
                    :ARG2 (s2p2 / prison
                                 :mod (s2c3 / country
                                            :name (s2n4 / name :op1 "Russia"))
                                 :duration (s2t3 / temporal-quantity
                                                :quant 20
                                                :unit (s2y2 / Year)))
                    :ARG3 s2s2))
```

# Sentence-level representation vs document-level representation

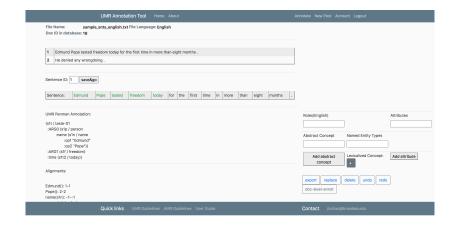
He denied any wrongdoing.

```
(s3d / deny-01
    :Aspect Performance
                                      (s3 / sentence
    :ARG0 (s3p / person
                                          :temporal ((s3d :before DCT))
           :ref-number Singular
                                          :modal ((s3d:AFF AUTH)
           :ref-person 3rd)
                                                  (s3d2:NEG
    :ARG1 (s3t / thing
                                                        (s3p :AFF AUTH)))
           :ARG1-of (s3d2 / do-02
                                          :coref ((s3p :same-entity s1p)))
                     :ARG0 s3p
                     :ARG1-of
                     (s3w / wrong-02))))
```

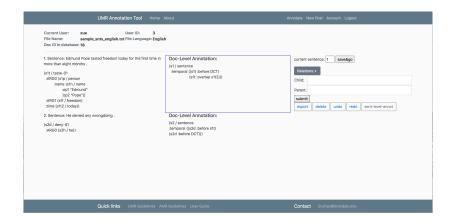
## UMR graph



#### UMR writer: sentence-level interface



#### UMR Writer: document-level interface



# Discussion question: Do we still need symbolic meaning representations?

- End-to-end neural models changed the landscape of NLP, e.g., Neural MT, machine reading
- Diminished returns for linguistic structures as an intermediate representation in some end-to-end systems, e.g., NMT
- However, neural models do have their limitations: hard to interpret, hard to anticipate errors, not naturally suited for logical/quantitative reasoning that human routinely perform. Systems based on symbolic meaning representations can provide a viable alternative
- Hard NLP problems cannot be solved without world knowledge, and a general purpose symbolic meaning representation can be used to distill structured knowledge from natural language text

# Adapting to the new environment when developing linguistic resources

- Do not design meaning representations as an intermediate representation, but rather as an end (or near-end) representation
- Support applications where neural models do not provide a good solution
  - Temporal reasoning that answers questions that cannot answered with a machine reading approach (not no comprehension)

#### Use cases of UMR

- Temporal reasoning
  - ► UMR can be used to extract temporal dependencies, which can then be used to perform temporal reasoning
- Knowledge extraction
  - UMR annotates aspect, and this can be used to extract habitual events or state, which are typical knowledge forms
- Factuality determination
  - UMR annotates modal dependencies, and this can be used to verify the factuality of events or claims
- As intermediate representation for dialogue systems where control is more needed.
  - ► UMR annotates entities and coreferences, which helps tracking dialogue states

### **UMR** summary

- ► UMR is a rooted directed node-labeled and edge-labeled document-level graph.
- ► UMR is a document-level meaning representation that builds on sentence-level meaning representation
- UMR aims to achieve semantic stability across syntactic variations and support logical inference
- UMR is a cross-lingual meaning representation that separates aspects of meaning from those that are language-specific
- We are testing UMR English, Chinese, Arabic, Arapahoe, Kukama, Sanapana, Navajo

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