# Reconsidering the Semantic Role(s) of Predicate Arguments

PRELIM Task 2 / SEMANTICS

#### FINAL PRESENTATION

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# Theta roles (linguistics) Semantic roles (comp. ling.)

Verbal meanings consist of information like:

Who did what to who(m)?

What happened to which individual?

...

Theta roles fill in the who (and some of the what)

Agent, Patient, Theme...



## PropBank

(22) Frameset hit "strike"

Arg0: hitter

Arg1: thing hit, target

Arg2: instrument of hitting

Ex1: Agentive subject: " $[A_{Arg0}]$  He $_i$ ] digs in the sand instead of  $[A_{Arg0}]$  \*trace\* $_i$ ] hitting  $[A_{Arg1}]$  the ball], like a farmer," said Mr. Yoneyama. (wsj\_1303)

Ex2: Instrumental subject: Dealers said [ $_{Arg1}$  the shares] were *hit* [ $_{Arg2}$  by fears of a slowdown in the U.S. economy]. (wsj\_1015)

Ex3: All arguments:  $[A_{rg0}]$  John] hit  $[A_{rg1}]$  the tree]  $[A_{rg2}]$  with a stick].



# Dowty ('91)

Dowty argued for the notion of:

proto-Agent and proto-Patient

Verb arguments only *tend* to have certain basic properties, and these *correlate* in Agent/Patient like ways

Arguments with more Agent properties tend to be **SUBJECT**, those with more Patient properties, **OBJECT** 



# Dowty's Properties

Proto-Agent and Proto-Patient properties from Dowty (1991)

Proto-Agent properties	Proto-Patient properties
Volitional involvement in the event or state	Undergoes change of state
Sentience (and/or perception)	Incremental theme
Causing an event or change of state in another participant	Causally affected by another participant
Movement (relative to another participant)	Stationary relative to movement of another participant
Exists independently of the event named by the verb	Does not exist independently of the event, or not at all

- Decomposing proto-roles to properties (c.f. VerbCorner)
- Traditional thematic roles emerge as prototypical configurations of properties.



Hartshorne, Joshua K., Claire Bonial, and Martha Palmer. "The VerbCorner Project: Toward an Empirically-Based Semantic Decomposition of Verbs." EMNLP. 2013.

## Kako ('06)

How stable are proto-role feature judgments when experimentally tested for a range of verbs?

#### The rom found the zarg.

- How likely is it that the rom chose to be involved in finding?
- How likely is it that the rom moved?

**—** ...



#### Kako's Findings aware caused change caused do Proto-Agent Properties **Dowty (91)** chose existed moved created Proto-Patient changed **Dowty (91) Properties** stationary \_6 0 6 Mean Difference Score (Subject - Object)



## What do we want to do?

- Confirm prior work by Dowty, Kako
  - Test Dowty's introspective claims empirically
  - Evaluate models of syntactic realization beyond Dowty's
- Proof-of-concept: annotating binary properties
  - Are judgments good? Stable?
- Demonstrate common information in various semantic resources



## Outline of Projects

- Automatically build corpus of annotated properties with VerbNet and SemLink
- Annotate proto-role properties using Mechanical Turk
  - Real sentences from PropBank
  - Artificial sentences with nonsense (nonce) arguments

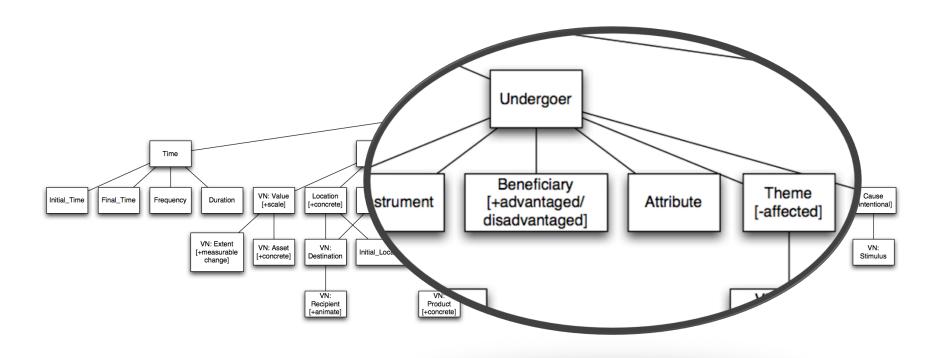


### What is VerbNet?

- Large lexicon of English verbs, categorized into 274 different classes
- VerbNet's thematic roles can be organized into a hierarchy with property inheritance
- Each verb class is associated with some subset of these thematic roles and corresponding syntactic realization



# VerbNet Hierarchy

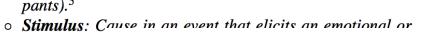




Bonial, Claire, William Corvey, Martha Palmer, Volha V. Petukhova, and Harry Bunt. "A hierarchical unification of LIRICS and VerbNet semantic roles." Semantic Computing (ICSC), 2011 Fifth IEEE International Conference on, pp. 483-489. IEEE, 2011.

## Properties from VerbNet

- o Actor: Participant that is the instigator of an event.
- Cause: Actor in an event (that may be animate or inanimate) that initiates the event, but that does not act with any intentionality or consciousness; it exists independently of the event. -LIRICS
- Agent: Actor in an event who initiates and carries out the event intentionally or consciously, and who exists independently of the event. -LIRICS
- Co-Agent: Agent who is acting in coordination or reciprocally with another agent while participating in the same event (specific to events with symmetrical participants).<sup>5</sup>



• **Undergoer**: instigator of

psychologica

• Instrument by an agent formed; it e

VN Role	Properties			
actor	instigates			
cause	instigates	causes	exists.independently	
agent	instigates	has.intent	exists.independently	
co-agent	instigates	has.intent	exists.independently	symmetric.participants
stimulus	instigates	causes	causes.perceptual-response	exists.independently
undergoer	not.instigates			
instrument	not.instigates	exists.independently	manipulated.by.an.agent	used.in.intentional.act



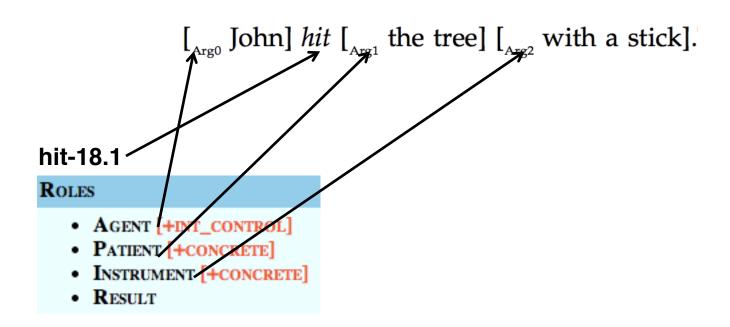
## Extracting Properties from VerbNet

- Break down VerbNet role definitions into a simple discrete set of Dowty-like binary properties
- Two purposes:
  - To generate set of questions that elicit judgments about these properties for MTurk annotation
  - To induce a set of properties on any VerbNetannotated data (e.g. SemLink)



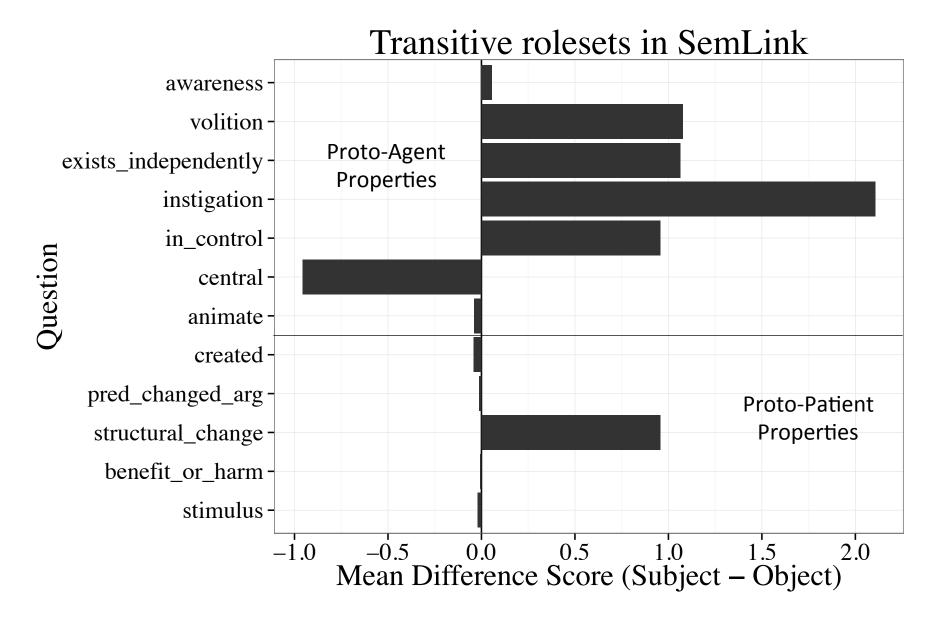
## SemLink

Partial VerbNet layer on top of PropBank

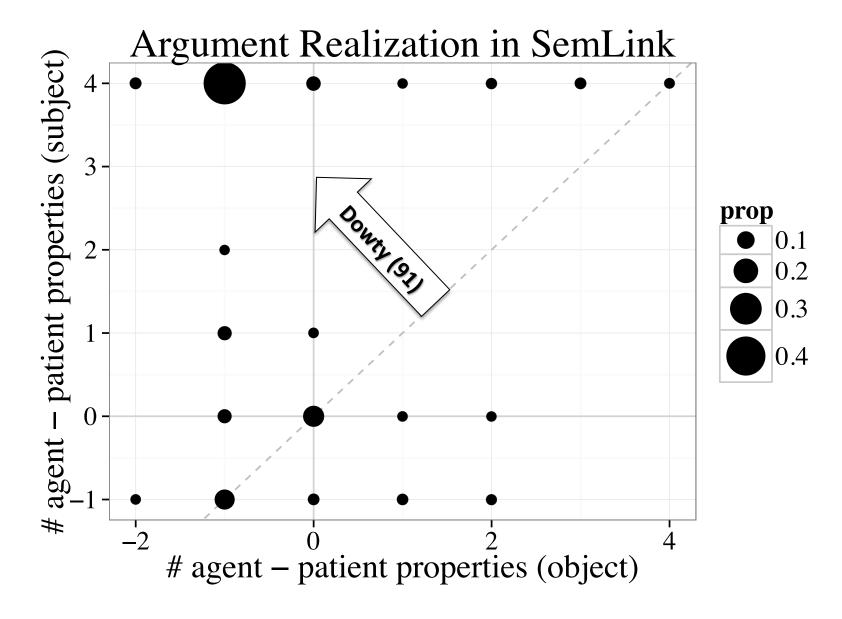




Palmer, Martha. "Semlink: Linking propbank, verbnet and framenet." Proceedings of the Generative Lexicon Conference. 2009.









# Mechanical Turk Project

#### Sentence 1

An assassin in Colombia killed a federal judge on a Medellin street.

For a federal judge:

How likely or unlikely is it that a federal judge chose to be involved in the killing?

very unlikely or unlikely on not enough information somewhat likely very likely

How likely or unlikely is it that the killing caused a change in a federal judge?

very unlikely on somewhat unlikely on ot enough information somewhat likely very likely



## Mechanical Turk Project

How likely or unlikely is it that The antibody was/were aware of being involved in the killing?
 very unlikely onot enough information osomewhat likely very likely
 Does this question make sense? No or one

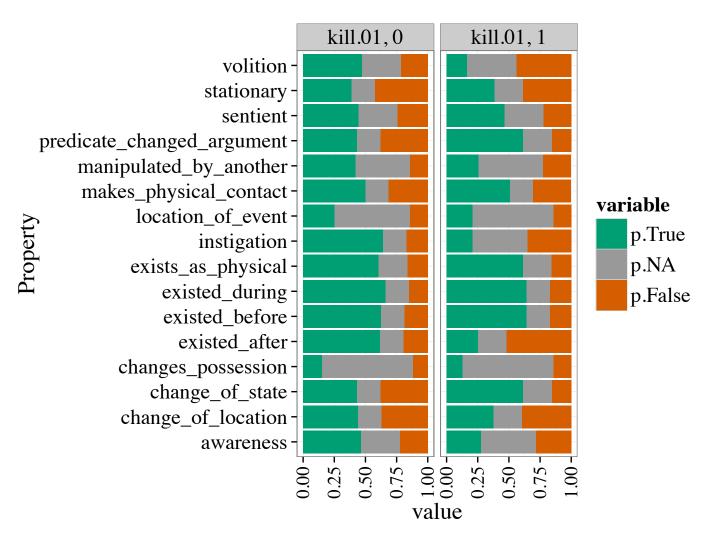


## Argument Properties

- 16 properties annotated by Turkers on 16 rolesets
- Properties derived from various sources
  - VerbNet
  - Dowty ('91), Kako ('06), Grimm ('10)
- ~25 properties identified but not used
- HIT can be extended easily to new properties



## HIT Results: kill.01





# Nonce-Argument Project

#### **Task**

#### Sentence 1

killing?
killing?



#### Motivation

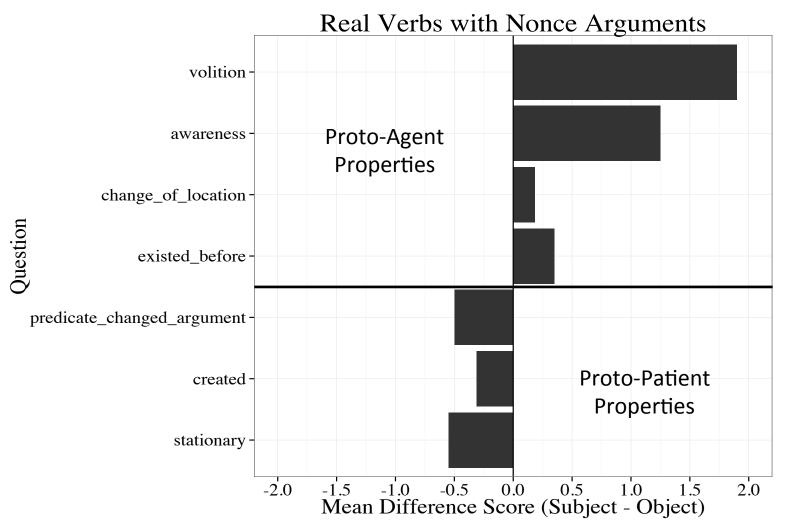
- Easy to run, since we already have infrastructure
- Natural comparison with previous work
  - VerbCorner
  - Kako ('06)
- Sanity check on MTurk annotation methodology
- Comparison between type- and token- level annotation.



#### Kako's Findings aware caused change caused do Proto-Agent Properties chose existed moved created Proto-Patient changed **Properties** stationary \_6 0 6 Mean Difference Score (Subject - Object)



# Comparison with Kako





## Conclusions

- We can use Mechanical Turk for direct annotation of predicate argument properties.
- The properties captured by VerbNet thematic roles support Dowty's proto-role hypothesis.
- Consistent Turker annotation of nonce argument properties further validates work by Dowty and Kako.



## **Future Directions**

- Data-driven methods for selecting proto-role properties
- Extension to FrameNet frame elements
- Predictive modeling of PropBank labels/ VerbNet roles from properties
- Integration of symbolic and connectionist models of semantic compositionality (under NSF INSPIRE grant 'Gradient symbolic computation' BCS-1344269)

