



# TOWARDS A DUTCH FRAMENET-STYLE SEMANTIC ROLE LABELER

Master's thesis, Chantal van Son (ReMa Linguistics)

**Disambiguating entities and their roles in  
texts based on background knowledge**

Friday 12 December 2014

# INTRODUCTION

1. John broke the window.
2. The window was broken by John.
3. The window broke.

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1. John broke the window. [SUBJECT]
2. The window was broken by John. [PREPOSITIONAL PHRASE]
3. The window broke.

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1. John broke the window. [DIRECT OBJECT]
2. The window was broken by John. [SUBJECT]
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1. John broke the window. [DIRECT OBJECT]
2. The window was broken by John. [SUBJECT]
3. The window broke. [SUBJECT]

Syntactic parsing does not represent full meaning of sentence:

John = AGENT, “the breaker”

the window = PATIENT, “the thing being broken”

# INTRODUCTION

- To summarize: a semantic role is the underlying conceptual relation that a syntactic constituent has with its predicate
- Semantic Role Labeling (SRL): automatic detection of semantic roles
  - Key task for answering “Who did What to Whom”, “Where”, “When”, etc. in IE, QA, MT, Summarization, etc.

# INTRODUCTION

- Statistical approaches for SRL driven by resources such as PropBank and FrameNet
- Different sets of roles:
  - PropBank: [John<sub>ARG0</sub>] stole [the watch<sub>ARG1</sub>].
  - FrameNet: [John<sub>THEFT#PERPETRATOR</sub>] stole [the watch<sub>THEFT#GOODS</sub>].

# OVERVIEW

- Introduction to SRL
- Research question
- Methodology
  - PropBank vs. FrameNet
  - NewsReader pipeline
  - Predicate Matrix
- Problems/challenges to solve
- ~~Results~~



# RESEARCH QUESTION

- Goal: FrameNet-style SRL for Dutch
  - [John<sub>THEFT#PERPETRATOR</sub>] stole [the watch<sub>THEFT#GOODS</sub>].
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## **Research question:**

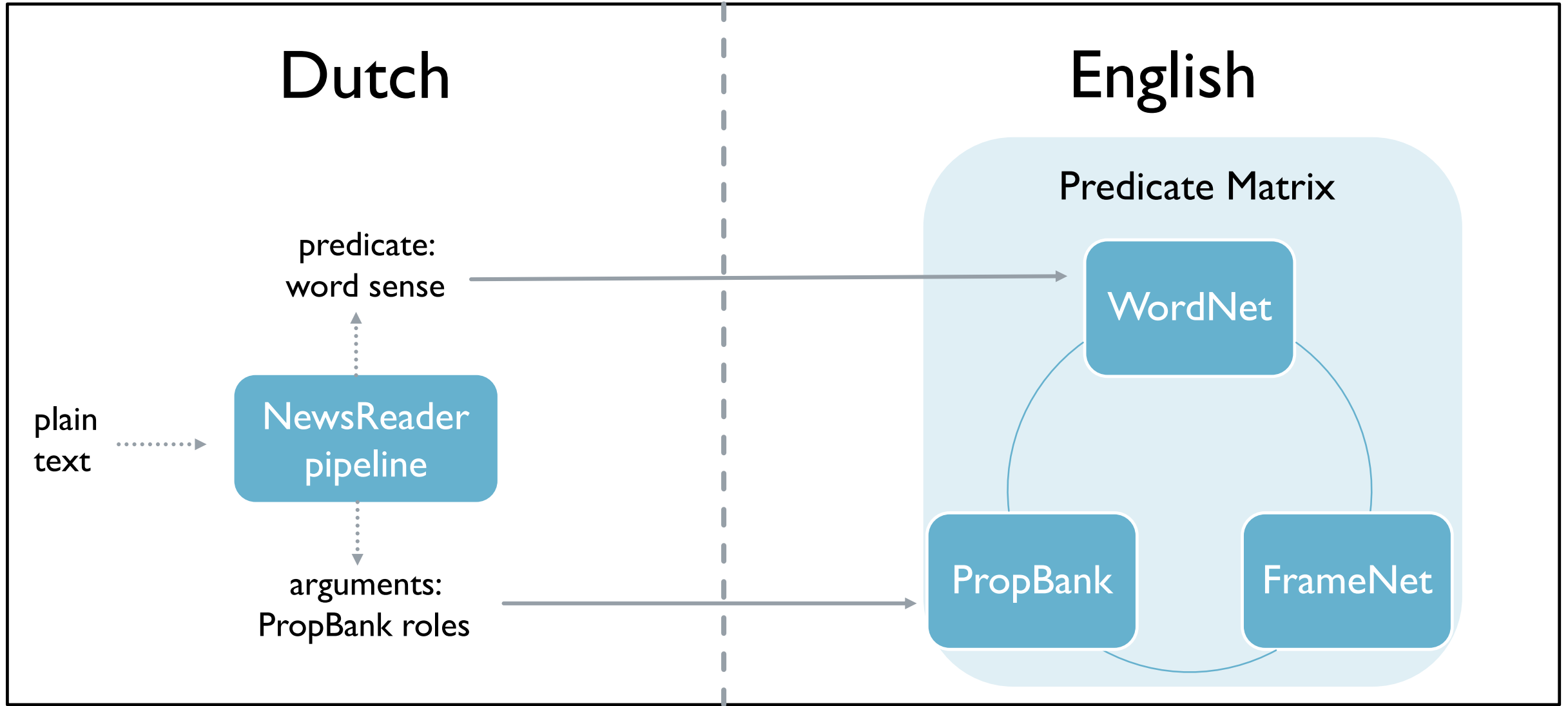
How can we perform FrameNet-style SRL in Dutch without a resource that is annotated with this specific information?

# METHODOLOGY

- Use available tools and resources:
  - Sonar Semantic Role Labeler (SSRL): PropBank-style
  - Predicate Matrix
    - Integration of PropBank, FrameNet and WordNet
  - Mappings between Dutch/English WordNets

# METHODOLOGY

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    - Mappings between Dutch/English WordNets
- Map FrameNet roles on top of PropBank roles generated by SSRL by using the mappings between resources and between languages



# FRAMENET

- Based on Frame Semantics (Fillmore)
  - Word meanings are organized around schematic conceptual scenarios (frames), which represent prototypical situations or states including specific kinds of entities that can participate
- Primarily a lexicographical project:
  - Group words into frames and back up frame-semantic descriptions with annotated examples

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# Commerce\_buy

## Definition

These are words describing a basic commercial transaction involving a **BUYER** and a **SELLER** exchanging **MONEY** and **GOODS**, taking the perspective of the **BUYER**. The words vary individually in the patterns of frame element realization they allow. For example, the typical pattern for the verb BUY: **BUYER** buys **GOODS** from **SELLER** for **MONEY**.

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## Frame Elements

**BUYER**

The **BUYER** wants the **GOODS** and offers **MONEY** to a **SELLER** in exchange for them.

**GOODS**

The FE **GOODS** is anything (including labor or time, for example) which is exchanged for **MONEY** in a transaction.

**SELLER**

The **SELLER** has possession of the **GOODS** and exchanges them for **MONEY** from a **BUYER**.

**MONEY** (non-core)

**MONEY** is the thing given in exchange for **GOODS** in a transaction.

**TIME** (non-core)

When the event occurs.



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## Lexical Units

*buy.v, buyer.n, purchase.v, purchase\_((act)).n, purchaser.n*

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<b>SELLER</b>	The <b>SELLER</b> has possession of the <b>GOODS</b> and exchanges them for <b>MONEY</b> from a <b>BUYER</b> .
<b>MONEY</b> (non-core)	<b>MONEY</b> is the thing given in exchange for <b>GOODS</b> in a transaction.
<b>TIME</b> (non-core)	When the event occurs.

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## Annotated example

Yesterday, **Abby** bought a **car** from **Robin** for **\$5,000**.

# PROPBANK

- Semantic role annotation of the Penn Treebank corpus
- More practical aim: provide training data for supervised SRL
- Verb-specific and theory-neutral approach
  - Arg0 t/m Arg5
  - Modifiers, e.g. ArgM-TIME, ArgM-LOC
- Lexicon to facilitate annotation; later evolved into a resource on its own

# Roleset ID: purchase.0 I

## Roles

**Arg0-PAG:** *purchaser*

**Arg1-PPT:** *thing purchased*

**Arg2-DIR:** *seller*

**Arg3-VSP:** *price paid*

**Arg4-GOL:** *benefactive*

## Example: With benefactive:

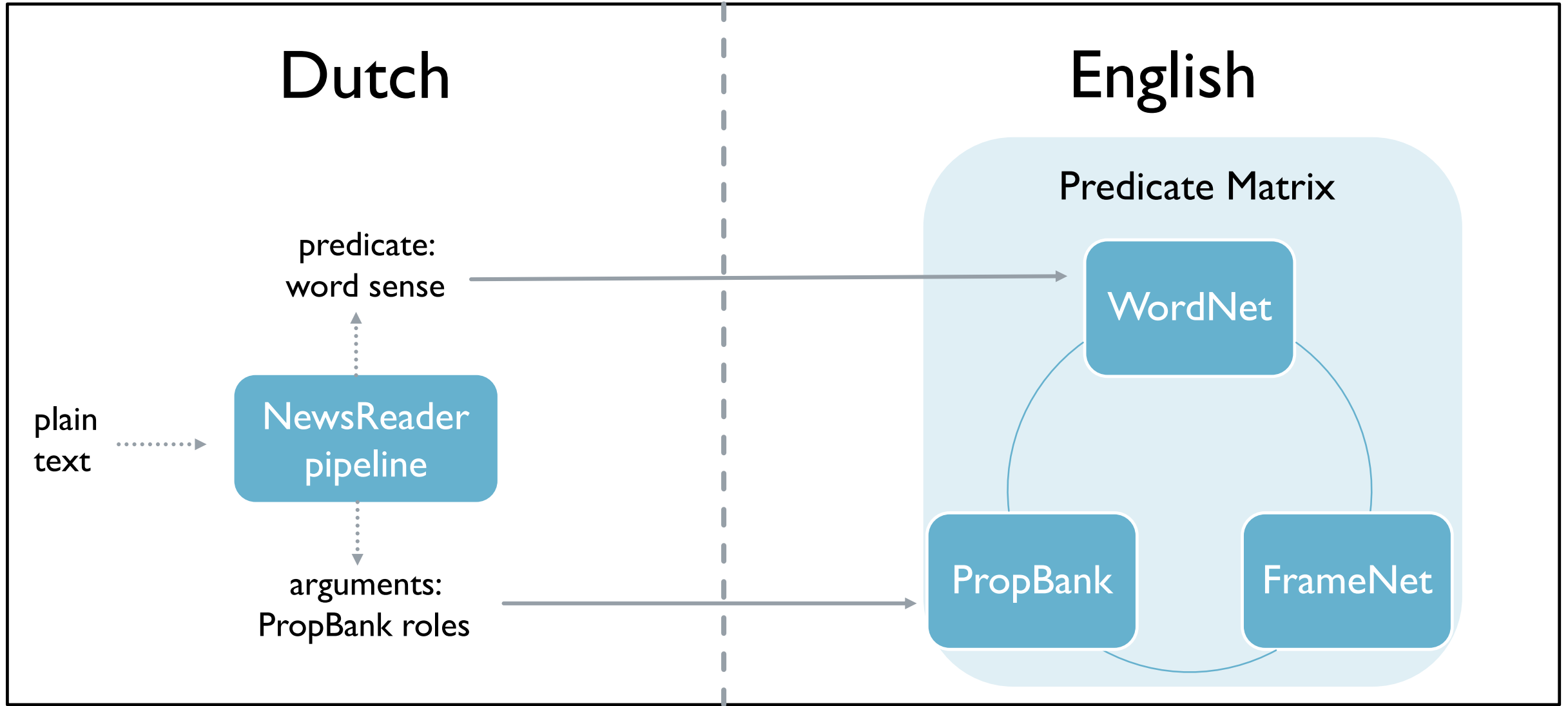
John purchased a dozen roses for his mother.

**Arg0:** John

**Rel:** purchased

**Arg1:** a dozen roses

**Arg4:** for his mother



# NEWSREADER PIPELINE

- 1) Tokenizer
- 2) Morphosyntactic parser (Alpino)
- 3) Word Sense Disambiguation
- 4) Ontotagger (Predicate Matrix)
- 5) Semantic Role Labeler (SSRL)

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Volgens Apple is dat vissen naar wachtwoorden een gebruikelijke praktijk.

```
<!--vissen-->
<term id="t_91" type="open" lemma="vissen" pos="verb" morphofeat="WW(inf,nom,zonder,zonder-n)">
  <span>
    <target id="w92"/>
  </span>
  <externalReferences>
    <externalRef resource="Cornetto" reference="d_v-317255" confidence="0.17348981"/>
    <externalRef resource="Cornetto" reference="d_v-317258" confidence="0.09935643"/>
    <externalRef resource="Cornetto" reference="r_v-9597" confidence="0.04414937"/>
    <externalRef resource="Cornetto" reference="r_v-9598" confidence="0.17084068"/>
  </externalReferences>
</term>
```

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# PREDICATE MATRIX

- Predicate information of multiple resources integrated
- Each row of the Predicate Matrix represents the mapping of a role over the different resources and includes all the aligned knowledge about its corresponding verb

odwn-eq\_synonym:d\_v-3757-v odwn-synset:kopen;aanschaffen; vn:get-|3.5.1 vn:|3.5.1 vn:buy  
wn:buy%2:40:00 mcr:ili-30-02207206-v fn:Commerce\_buy fn:buy.v pb:buy.01 mcr:0  
mcr:economy mcr:Buying mcr:Dynamic;Possession; mcr:possession mcr:get%2:40:00 wn:|02  
wn:024 SEMLINK fn-pb-role:Buyer#0 SEMLINK;FN\_FE fn-pb-role:Means#3 fn-pb-  
role:Duration#4 fn-pb-role:Means#2 fn-pb-role:Goods#1 vn:obtain-|3.5.2 vn:|3.5.2 vn:obtain-  
|3.5.2-1 vn:|3.5.2-1 vn:purchase wn:purchase%2:40:00 fn:purchase.v pb:purchase.01 wn:34  
SEMLINK;PREDICATE\_MAPPING SEMLINK;PREDICATE\_MAPPING;FN\_FE fn-pb-  
role:Buyer#3 fn-pb-role:Money#3

```
<term id="t1.30" lemma="voegen" pos="V.verb" type="open">
  <span>
    <!--voegen-->
    <target id="w1.30"/>
  </span>
  <externalReferences>
    <externalRef confidence="0.388571" reference="nld-21-d_v-7822-v" resource="cdb2.0-nld-all.infy.0.0.no-allwords">
      <externalRef resource="predicate-matrix1.1">
        <externalRef reference="fn:Rope_manipulation" resource="fn"/>
        <externalRef reference="pb:tie.01" resource="pb"/>
        <externalRef reference="fn-pb-role:Agent#0" resource="fn-pb-role"/>
        <externalRef reference="fn-pb-role:Means#2" resource="fn-pb-role"/>
        <externalRef reference="fn-pb-role:Instrument#3" resource="fn-pb-role"/>
        <externalRef reference="fn-pb-role:Agent#1" resource="fn-pb-role"/>
        <externalRef reference="fn-role:Location" resource="fn-role"/>
      </externalRef>
      <externalRef resource="predicate-matrix1.1">
        <externalRef reference="fn:Attaching" resource="fn"/>
        <externalRef reference="pb:connect.01" resource="pb"/>
        <externalRef reference="fn-pb-role:Agent#0" resource="fn-pb-role"/>
        <externalRef reference="fn-pb-role:Goal#2" resource="fn-pb-role"/>
        <externalRef reference="fn-pb-role:Item#1" resource="fn-pb-role"/>
        <externalRef reference="pb:link.01" resource="pb"/>
        <externalRef reference="pb:tie.01" resource="pb"/>
        <externalRef reference="fn-pb-role:Instrument#3" resource="fn-pb-role"/>
        <externalRef reference="fn-role:Goal" resource="fn-role"/>
        <externalRef reference="fn:tie.v" resource="fn"/>
        <externalRef reference="fn-pb-role:Connector#1" resource="fn-pb-role"/>
      </externalRef>
    </externalRef>
  </externalReferences>
</term>
```

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```
<predicate id="pr24">
  <span>
    <target id="t_182"/>
  </span>
  <role id="r44" semRole="ArgM-NEG">
    <span>
      <target id="t_178" head="yes"/>
    </span>
  </role>
  <role id="r50" semRole="Arg0">
    <span>
      <target id="t_175" head="yes"/>
      <target id="t_176"/>
      <target id="t_177"/>
      <target id="t_178"/>
    </span>
  </role>
  <role id="r52" semRole="Arg1">
    <span>
      <target id="t_176"/>
      <target id="t_177" head="yes"/>
    </span>
  </role>
</predicate>
```

# CURRENT BASELINE

- Looks for predicate in SRL layer
- Finds WSD and PM data for this predicate in term layer
- Assigns all frames of all word senses to the predicate
- Assigns all FrameNet roles to the arguments if they correspond to PropBank roles

Fine-tuning: filtering frames and roles (e.g. by WSD-score, frequency of frame)

# FUTURE WORK: CHALLENGES

- Quality of Predicate Matrix: wrong or missing information
  - Association between PropBank and FrameNet roles not given
  - Frames and/or roles not given at all
- Coverage of FrameNet
- Differences PropBank/FrameNet
  - Metaphorical usages and support constructions
- From Dutch to English
  - Quality of WordNet mappings
  - English Frames





THANK YOU FOR YOUR ATTENTION.

QUESTIONS?

