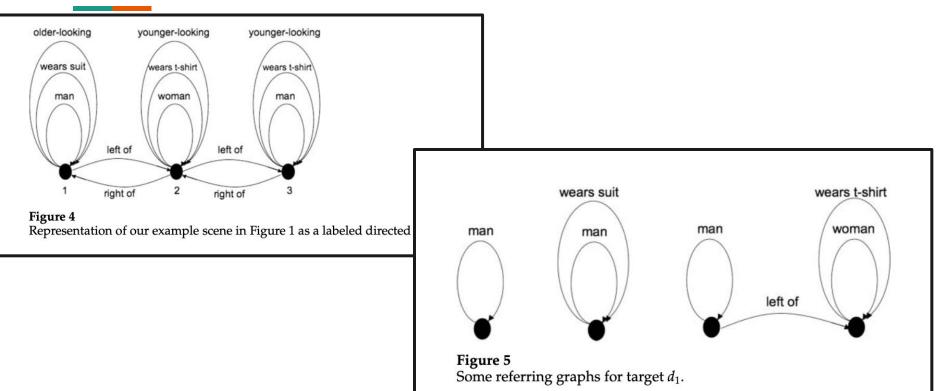
Converting RDF Data into MRS for generation

Liz Conrad – DELPH-IN 2023

Generating Referring Expressions

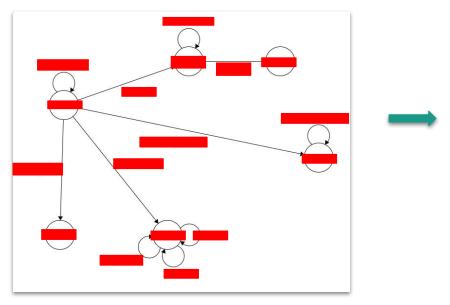
- GOAL: Generate a variety of referring expressions for different entities
 - indefinite expressions
 - definite expressions
 - pronouns
 - etc.

Graph Based Generation



Krahmer and Deemter (2012)

General Idea



Graph representation of some entity

 But A the second of t	
 No. 1991 Control water matched to the control of states the states of the sta	, we can be according to the contract of the mass production where, in the later parameter matrix
 The first of your make/of the contract of the 20th 2000 The first of your make/of the contract of the contra	BTL CONTRACTOR FOR AN AND AN AND AN AN AN AND AN
 The South Construction of the Constru	A TATE A MAR BER IN THE ARE REAL AND A MAR BEEN A TATE
 The first of year make/of the control of the 20th 19901 The first of year make/of the control of the control	The Clubble Concerned Autorian Course 2004 (2005
 The first of some marked is the source of the State formula to the first of the source of t	A TEAT IN AND AND IN TEAT IN AND INTERNAL AND
<pre>The 1 till to new matrix to the control of the CDUM CDUC to the the time control of the time to the the time to the The 1 till to the CDUM CDUC to the time to the the time to the time to the time to the time to the 1 till to the CDUM CDUC to the time to the The 1 till to the CDUM CDUC to the time to the The 1 till to the CDUM CDUC to the time to the time to the time to the CDUM CDUC to the time to the time to the time to the CDUM CDUC to the time to the The 1 till to the CDUM CDUC to the time to the The 1 till to the CDUM CDUC to the time CDUM CDUC</pre>	The Collins' rear metals a constrained 20th 2000
 The first interaction of the state of the state of the state of the first interaction of the first interaction of the state of	A TELL CONTRACTOR CONTRACTOR CONTRACTOR CONTRACTOR
<pre>The first is the control of the relative train to the first is the control of the control of the relative the first is the control of the control of the relative to the first is the control of the control of the relative the first is the control of the control of the control of the first is the control of the control of the control of the first is the control of the control of the control of the first is the control of the control of the control of the first is the control of the control of the control of the control of the first is the control of the first is the control of the first is the control of the co</pre>	The Statistic Trade metals and a Court State 20th 2000
<pre>No investor a state mark allowing and a state of a state of a The first is a state mark allowing and a state of a state of the first is a state mark allowing and a state of a state of the first is a state mark allowing and allowing allowing allowing The first is a state mark allowing and allowing allowing allowing The first is a state mark allowing allowing allowing allowing the first is a state mark allowing allowing allowing allowing the first is a state mark allowing allowing allowing allowing the first is a state mark allowing a</pre>	in the state of the second state of the
<pre>The first is the SME SHOP CHEET is related to the first is the term of the state show the shop of the state is The first is the smear model is the state state is the The first is the state model is the state state state is the The first is the state model is the state state state is the The first is the state model is the state state state is the term of the state state state state state state state is the state state state state state state state state state state is the state state st</pre>	The Could be Care and CACE of the reducted of the
<pre>interface in the mark and the interface interface The first interface interface in the mark and the second interface interface interface interface interface interface The first interface models in the second interface interface</pre>	A TEAT A MARKANES AND A COMPANY AND A
The First Constant Constant Constant Constant Sector Constant Cons	The Could be Care and COCOUNT and reducted a could
ne territ te versioner in territ anna serie a suit The Full of the model and a suit dama 20, 2100	A TANTA A VINA MENANA A VINA A VINA A VINA A
The First Contract Co	The Could be Care and Could be considered as a set
	A TELE STANDAR AND INCOME AND A STANDAR AND A STANDARD
The second se	The First Communication of the Same 20, 2100
	the second second many procession and the second

Resulting referring expressions, generated by the ERG from MRS

General Pipeline

- 1. Obtain a graph representation of an entity
- 2. Convert the graph to MRS using three levels of rules
 - a. LOW LEVEL 'nitty-gritty' rules to combine MRS fragments (e.g. via intersective combination)
 - b. MID LEVEL rules for particular syntactic/semantic phenomena that use the low level rules
 - c. HIGH LEVEL rules for the domain of interest that use the mid level rules
- 3. Generate English text from the MRS using the ERG

Low Level Rules



Ann Copestake Computer Laboratory University of Cambridge New Museums Site Pembroke St, Cambridge, UK aac@cl.cam.ac.uk Alex Lascarides Division of Informatics University of Edinburgh 2 Buccleuch Place Edinburgh, Scotland, UK alex@cogsci.ed.ac.uk Dan Flickinger CSLI, Stanford University and YY Software Ventura Hall, 220 Panama St Stanford, CA 94305, USA danf@csli.stanford.edu

Abstract

We develop a framework for formalizing semantic construction within grammars expressed in typed feature structure logics, including HPSG. The approach provides an alternative to the lambda calculus; it maintains much of the desirable flexibility of unificationbased approaches to composition, while constraining the allowable operations in order to capture basic generalizations and improve maintainability. 4. All signs have an index functioning somewhat like a λ -variable.

A similar approach has been used in a large number of implemented grammars (see Shieber (1986) for a fairly early example). It is in many ways easier to work with than λ -calculus based approaches (which we discuss further below) and has the great advantage of allowing generalizations about the syntax-semantics interface to be easily expressed. But there are problems. The operations are only specified in terms of the TFS logic: the interpretation relies on an intuitive correspondence with a conventional logical represen-

Low Level Rules

```
def intersective(hole_ssement, plug_ssement, arg_name, lbl_identity, head):
    11 11 11
   TOP = LBL/TOP of head
   INDEX = INDEX of head
   RELS = sum of both RELS lists
   HCONS = sum of both HCONS lists
   ICONS = sum of both ICONS lists
    VARIABLES = combine both VARIABLBES dicts
   HOLES = HOLES list - ARG hole (which gets plugged)
   EQs = EQs + hole.TOP=plug.TOP + hole.ARG.variable=plug.INDEX
    :param hole_ssement: SSEMENT object with the hole being filled
    :param plug_ssement: SSEMENT object plugging the hole
    :param arg_name: ARG that is the hole
    :param lbl_identity: whether the hole and plug should have their labels identified
    :param head: which SSEMENT object is the semantic head. Either member of the Fragment enumeration (Fragment.hole or Fragment.plug)
    :return: the new combined SSEMENT
    11 11 11
```

Low Level Rules

```
def scopal_quantifier(scoping_ssement, scoped_ssement):
    11 11 11
   Scopal rules for quantifiers (plug both the ARGO and RSTR holes)
   TOP = new |B|
   INDEX = INDEX of scoped
   RELS = sum of both RELS lists
   HCONS = sum of both HCONS lists + scoping.holes.RSTR=scoped.TOP
   ICONS = sum of both ICONS lists
   VARIABLES = combine both VARIABLBES dicts
   HOLES = HOLES list - ARGO hole of scoping (which gets plugged) - RSTR hole of scoping (plugged via geg)
   EOs = EOs + hole.TOP=plug.TOP + scoping.ARGO.variable=scoped.INDEX
    :param scoping_ssement: SSEMENT object doing the scoping
    :param scoped_ssement: SSEMENT object being scoped
    :return: New combined SSEMENT object
    11 11 11
```

PARTS OF SPEECH

🚨 Liz Conrad

def noun(noun_pred, constraints=None):

return ep(noun_pred, constraints)

🛎 Liz Conrad

def verb(verb_pred, constraints=None):
 return ep(verb_pred, constraints)

🚨 Liz Conrad

def pronoun(constraints=None):
 pron_ep = ep("pron", constraints)
 pron_q = ep("pronoun_q")

pron_mrs = quant_phr(pron_q, pron_ep)
return pron_mrs

LizConrad
def adjective(adj_pred):
 return ep(adj_pred)

LizConrad
def preposition(prep_pred):
 return ep(prep_pred)

LizConrad
def quantifier(quant_pred):
 return ep(quant_pred)

```
Liz Conrad
def quant_phr(quant_ssement, noun_ssement):
   # perform scopal combination with the quantifier and the noun
   return scopal_quantifier(quant_ssement, noun_ssement)
Liz Conrad
def adj_phr(adj_ssement, noun_ssement):
   # perform intersective combination with the ADJ and NOUN
   # plug ADJ.ARG1 with NOUN
   # identify labels
   # assign NOUN (plug) as the HEAD
    return intersective(adj_ssement, noun_ssement, "ARG1", True, Fragment.PLUG)
```

Liz Conrad

def poss_phr(possessor_ssement, possessee_ssement):

get poss EP

poss = ep("poss", None, {"ARG0": "e", "ARG1": "u", "ARG2": "u"})

plug ARG1 hole with noun, identify labels, assign the noun (plug) as the head

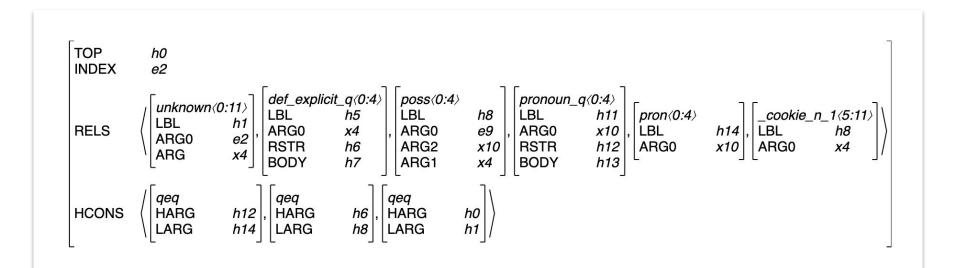
poss_arg1_plugged = intersective(poss, possessee_ssement, "ARG1", True, Fragment.PLUG)

plug ARG2 hole with pron_ssement, don't identify labels, assign the SSEMENT with the hole as the head
(i.e. the one with the noun at this point)

poss_arg2_plugged = intersective(poss_arg1_plugged, possessor_ssement, "ARG2", False, Fragment.HOLE)

def_explicit_q with poss
def_q = quantifier("def_explicit_q")

final_poss = quant_phr(def_q, poss_arg2_plugged)



Liz Conrad

def poss_phr(possessor_ssement, possessee_ssement):

get poss EP

poss = ep("poss", None, {"ARG0": "e", "ARG1": "u", "ARG2": "u"})

plug ARG1 hole with noun, identify labels, assign the noun (plug) as the head

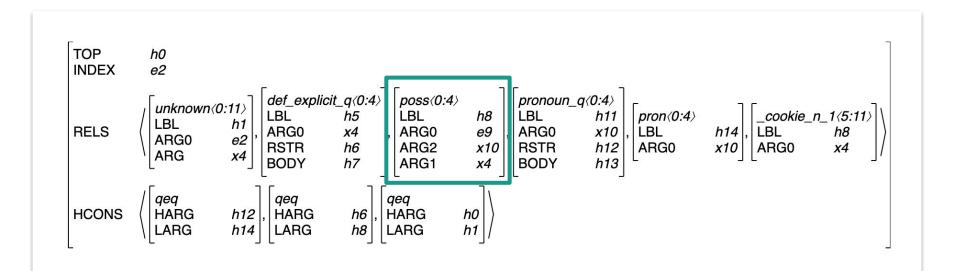
poss_arg1_plugged = intersective(poss, possessee_ssement, "ARG1", True, Fragment.PLUG)

plug ARG2 hole with pron_ssement, don't identify labels, assign the SSEMENT with the hole as the head
(i.e. the one with the noun at this point)

poss_arg2_plugged = intersective(poss_arg1_plugged, possessor_ssement, "ARG2", False, Fragment.HOLE)

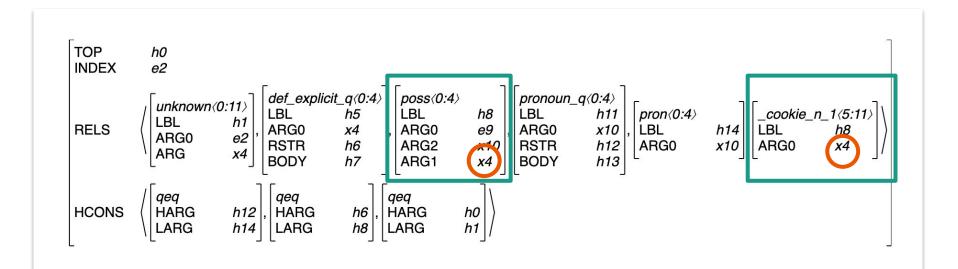
def_explicit_q with poss
def_q = quantifier("def_explicit_q")

final_poss = quant_phr(def_q, poss_arg2_plugged)



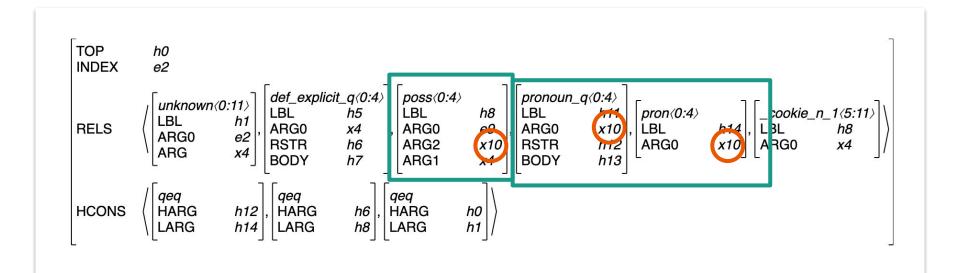
±LizConrad def poss_phr(possessor_ssement, possessee_ssement): # get poss EP poss = en("noss". None. {"ARG0": "e". "ARG1": "u". "ARG2": "u"}) # plug ARG1 hole with noun, identify labels, assign the noun (plug) as the head poss_arg1_plugged = intersective(poss, possessee_ssement, "ARG1", True, Fragment.PLUG) " plug ARG0 hole with the noun at this point) poss_arg2_plugged = intersective(poss_arg1_plugged, possessor_ssement, "ARG2", False, Fragment.HOLE) # def_explicit_g with poss

def_q = quantifier("def_explicit_q")
final_poss = quant_phr(def_q, poss_arg2_plugged)



±LizConrad def poss_phr(possessor_ssement, possessee_ssement): # get poss EP poss = ep("poss", None, {"ARG0": "e", "ARG1": "u", "ARG2": "u"}) # plug ARG1 hole with noun, identify labels, assign the noun (plug) as the head noss arc1 plugged = intersective(noss_possessee_ssement_"ARG1"_True_Eragment_PLUG) # plug ARG2 hole with pron_ssement, don't identify labels, assign the SSEMENT with the hole as the head # (i.e. the one with the noun at this point) poss_arg2_plugged = intersective(poss_arg1_plugged, possessor_ssement, "ARG2", False, Fragment.HOLE) # def_explicit_q with poss def_g = quantifier("def_explicit_q")

final_poss = quant_phr(def_q, poss_arg2_plugged)



🛎 Liz Conrad

def poss_phr(possessor_ssement, possessee_ssement):

get poss EP

poss = ep("poss", None, {"ARG0": "e", "ARG1": "u", "ARG2": "u"})

plug ARG1 hole with noun, identify labels, assign the noun (plug) as the head

poss_arg1_plugged = intersective(poss, possessee_ssement, "ARG1", True, Fragment.PLUG)

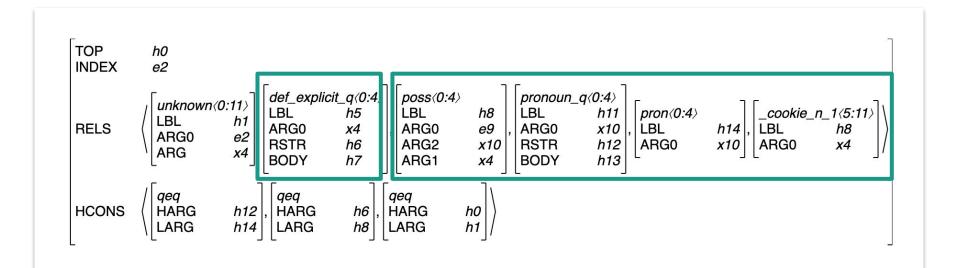
plug ARG2 hole with pron_ssement, don't identify labels, assign the SSEMENT with the hole as the head
(i.e. the one with the noun at this point)

poss_arg2_plugged = intersective(poss_arg1_plugged, possessor_ssement, "ARG2", False, Fragment.HOLE)

def_explicit_q with poss

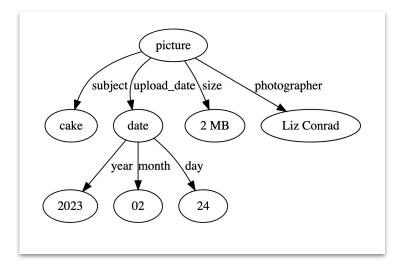
def_q = quantifier("def_explicit_q")

final_poss = quant_phr(def_q, poss_arg2_plugged)



High Level Rules

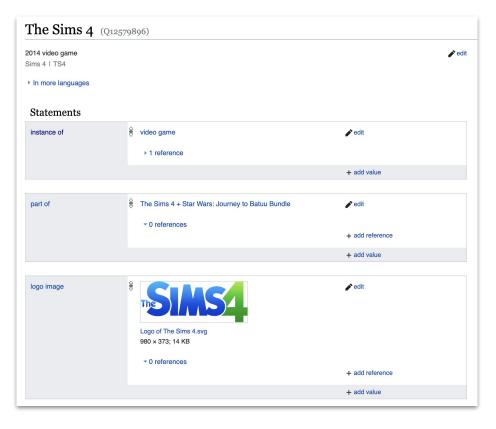
```
# DOMAIN RULES
# NODE RULES
* Liz Conrad
def event_node(event_pred_label):
    return noun(event_pred_label, {'NUM': 'sg'})
* Liz Conrad
def object_node(object_pred_label):
    return noun(object_pred_label)
```



Switching to WikiData

- Existing structured data
- Can obtain partial RDF dumps
- Choosing three related domains
 - Video games
 - Video game developers
 - Video game genres

Entity Example



Property Example

instance of (P31)

that class of which this subject is a particular example and member; different from P279 (subclass of); for example: K2 is an instance of mountain; volcano is a subclass of mountain (and an instance of volcanic landform)

is a I is an I unique individual of I unitary element of class I rdf:type I type I ∈ I example of

In more languages

Configure

Language	Label	Description	Also known as
English	instance of	that class of which this subject is a particular example and member; different from P279 (subclass of); for example: K2 is an instance of mountain; volcano is a subclass of mountain (and an instance of volcanic landform)	is a is an unique individual of unitary element of class rdf:type type ∈ example of

Aspirationally...

- By focusing on a subset of properties from each domain, will hopefully be able to generate referring expressions such as...
 - The Sims 4
 - \circ A life simulation game
 - A life simulation game developed by Maxis
 - A life simulation game released in 2014 by Maxis
 - The Sims 4, a life simulation game released in 2014 by Maxis
 - o ...

QUESTIONS & DISCUSSION

- 1. What would be good terminology to use for the mid-level rules in particular?
- 2. What existing projects are there that involve building MRS fragments outside of a grammar?
- 3. What other domains/use cases can you imagine for this type of system?
- 4. How would you imagine evaluating this system?