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*Chapter 18.2-18.5*

*Text Coherence*

# *Overview*

- Leftovers: Centering Theory
- Leftout: FOPL
- Text coherence
- Coherence resolution
- Inference
- Inference-based coherence resolution
- Discourse structure

## *Review: Pronoun resolution*

- Some “hard constraints” on possible antecedents
- Many “soft” constraints, largely salience factors and parallelism
- “Soft” constraints can conflict
- Pronoun resolution algorithms must encode constraints and mediate between them.

## *Centering Theory*

- Discourse model keeps track of entity being “centered” on in each utterance.
- Every utterance ( $U_n$ ) has:
  - $C_b(U_n)$  the ‘*backward looking center*’, which is the entity being centered on after  $U_n$  is interpreted.
  - (Exception: For the first utterance in a discourse is undefined.)
  - $C_f(U_n)$  the ‘*forward looking centers*’, an ordered (e.g., by grammatical role) list of all the entities referred to in  $U_n$ .

## *Centering Theory*

- Every utterance ( $U_n$ ) has:
  - ...
  - $C_b(U_{n+1})$  = the highest ranked element of  $C_f(U_n)$  mentioned in  $U_{n+1}$  ‘by definition’.
  - $C_p(U_n)$  the *preferred center*, the highest ranking element of  $C_f(U_n)$ .

## *Intersentential relationships*

	$C_b(U_2) = C_b(U_1)$ or undefined $C_b(U_1)$	$C_b(U_2) \neq C_b(U_1)$
$C_b(U_2) = C_p(U_2)$	Continue	Smooth-Shift
$C_b(U_2) \neq C_p(U_2)$	Retain	Rough-Shift

## *Rules*

- Rule 1: If any element of  $C_f(U_n)$  is realized by a pronoun in utterance  $U_{n+1}$ , then  $C_b(U_{n+1})$  must be too.
- Rule 2: Transition states are ordered:  
Continue › Retain › Smooth-Shift › Rough-Shift

## *Algorithm*

- Generate possible  $C_b$ - $C_f$  combinations for each possible set of reference assignments.
- Filter by constraints (e.g., syntactic coreference constraints, selectional restrictions, centering rules and constraints).
- Rank by transition orderings.
- Pick the reference assignment that gives the most preferred relation in Rule 2.



## *First Order Predicate Logic*

- Representation of sentence meanings, assuming someone else has figured out lexical meanings
- → The meaning of life is life'
- Represent predicate-argument relations, boolean connectives between predicates, universal and existential quantification.
- Rules of reasoning over FOPL are statements well-studied

## *FOPL: Building blocks*

- Predicate names
- Variables
- Boolean connectives:  $\wedge$ ,  $\vee$ ,  $\Rightarrow$ ,  $\neg$
- Quantifiers:  $\forall$ ,  $\exists$

## *FOPL: Quantifier scope*

- Quantifiers bind particular variables, and take scope over everything to the right of them in an expression (modulo parentheses)
- Quantifiers bind every instance of their variables in their scope.
- Variables outside the scope of any quantifier are ‘free’

## *FOPL: Examples*

- A dog barked:  $\exists x, e_i \text{ dog}(x), \text{ barked}(e_i, x), \text{ past}(e_i)$
- All dogs bark:  $\forall x \exists e_i \text{ dog}(x) \Rightarrow \text{ bark}(e_i, x)$
- Kim's friend left:  $\exists x, e_i \text{ friend-of}(x, k), \text{ leave}(e_i, x), \text{ past}(e_i)$
- Everyone loves someone:  $\forall x \exists e_i, y \text{ love}(e_i, x, y)$   
 $\exists y \forall x \exists e_i \text{ love}(e_i, x, y)$

## *Text coherence*

- John hid Bill's car keys. He was drunk.
- #John hid Bill's car keys. He likes spinach.

## *Coherence relations (1 of 2)*

- **Result:** Infer that the state or event asserted by  $S_0$  causes or could cause the state or event asserted by  $S_1$ .
- **Explanation:** Infer that the state or event asserted by  $S_1$  causes or could cause the state or event asserted by  $S_0$ .
- **Parallel:** Infer  $p(a_1, a_2, \dots)$  from the assertion of  $S_0$  and  $p(b_1, b_2, \dots)$  from the assertion of  $S_1$ , where  $a_i$  and  $b_i$  are similar, for all  $i$ .

## *Coherence relations (2 of 2)*

- **Elaboration:** Infer the same proposition  $P$  from the assertions of  $S_0$  and  $S_1$ .
- **Occasion:** A change of state can be inferred from the assertion of  $S_0$ , whose final state can be inferred from  $S_1$ , or a change of state can be inferred from the assertion of  $S_1$ , whose initial state can be inferred from  $S_0$ .

## *Coherence resolution*

- Determine the relationships between sentences or discourse segments
- Discover inferences that should be made
- Useful for IR, text summarization, pronoun resolution



## *Inference*

- Sound inference, e.g., modus ponens (deduction):

$$\frac{\alpha \Rightarrow \beta \quad \alpha}{\beta}$$

- Unsound inference, e.g., abduction:

$$\frac{\alpha \Rightarrow \beta \quad \beta}{\alpha}$$

- Associate ‘unsound’ conclusions with some kind of weight or cost, and make the DEFEASIBLE.

## *Inference-Based Coherence Resolution*

- Establish axioms
  - Pertaining to coherence relations
  - Encoding world knowledge
- Represent discourse segments in the same formalism as the axioms
- Establish coherence by creating a chain of reasoning linking the sentence interpretations that is rooted the assertion of a coherence relation
- In the process, posit unprovable assumptions
- → inference

## *Coherence relation axioms*

$$[1] \quad \forall e_i, e_j \text{ Explanation}(e_i, e_j) \Rightarrow \text{CoherenceRel}(e_i, e_j)$$

$$[2] \quad \forall e_i, e_j \text{ Result}(e_i, e_j) \Rightarrow \text{CoherenceRel}(e_i, e_j)$$

...

$$[3] \quad \forall e_i, e_j \text{ cause}(e_j, e_i) \Rightarrow \text{Explanation}(e_i, e_j)$$

$$[4] \quad \forall e_i, e_j \text{ cause}(e_i, e_j) \Rightarrow \text{Result}(e_i, e_j)$$

...

## *World knowledge axioms*

- [5]  $\forall x, y, e_i \text{ drunk}(e_i, x) \Rightarrow$   
 $\exists e_j, e_k \text{ diswant}(e_j, y, e_k) \wedge \text{drive}(e_k, x) \wedge \text{cause}(e_i, e_j)$
- [6]  $\forall x, y, e_j, e_k \text{ diswant}(e_j, y, e_k) \wedge \text{drive}(e_k, x) \Rightarrow$   
 $\exists z, e_l, e_m \text{ diswant}(e_l, y, e_m) \wedge \text{have}(e_m, x, z) \wedge$   
 $\text{carkeys}(z, x) \wedge \text{cause}(e_j, e_l)$
- [7]  $\forall x, y, z, e_l, e_m \text{ diswant}(e_l, y, e_m) \wedge \text{have}(e_m, x, z) \Rightarrow$   
 $\exists e_n \text{ hide}(e_n, y, x, z) \wedge \text{cause}(e_l, e_n)$
- [8]  $\forall e_i, e_j, e_k \text{ cause}(e_i, e_j) \wedge \text{cause}(e_j, e_k) \Rightarrow$   
 $\text{cause}(e_i, e_k)$

## *Translation of two statements*

[9]  $\exists e_1, ck \text{ hide}(e_1, j, b, ck) \wedge \text{carkeys}(ck, b)$

[10]  $\exists e_2 \text{ drunk}(e_2, h)$

## *Reasoning from coherence to the statements*

- [A] Assume coherence, i.e.,  $\text{Coherence-Rel}(e_1, e_2)$
- [B] Infer  $\text{Explanation}(e_1, e_2)$  [1],[A]
- [C] Infer  $\text{cause}(e_2, e_1)$  [3],[B]
- [D] Infer  $\text{cause}(e_2, e_3) \wedge (e_3, e_1)$  [8],[C]
- [E] Infer  $\text{cause}(e_2, e_4) \wedge (e_4, e_3)$  [8],[D]
- [F] Infer  $\text{diswant}(e_3, j, b) \wedge \text{have}(e_5, b, ck)$  [9],[D],[7]

## *Reasoning from coherence to the statements*

[G] Infer  $\text{diswant}(e_3, j, e_6) \wedge \text{drive}(e_6, b)$  [9],[8],[F]

[H] Infer  $\text{drunk}(e_2, b)$  [5],[8],[G]

- But [H] equals [10], if  $b = h$  (pronoun resolution)
- Chain included [1],[9], and [10], so the discourse was coherent.
- Along the way, we inferred things not explicitly stated in the dicourse: John did not want Bill to drive; This is why John hid Bill's keys.

## *Reasoning from coherence to the statements*

- Serious search problem
- ... managing the size of the search space
- ... choosing the best possibility
- Hobbs et al (1993) deal with this by assigning assumption costs to each inference.



## *Discourse structure*

- Always looking for coherence between adjacent pairs of sentences would give incorrect results.
- Instead, search for structure in discourse, and look for coherence between adjacent discourse segments.
- ‘Parsing’ discourse structure (a side effect of the above) is useful for summarization, IR, etc. Possibly also for pronoun resolution.

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