# **CMPT-413: Computational Linguistics**

**Anoop Sarkar** 

anoop@cs.sfu.ca

www.sfu.ca/~anoop/courses/CMPT-413-Spring-2003.html

## **Discourse Processing**

- Multiple sentences, dialogs
- Human-human (Switchboard corpus) and human-computer interaction (ATIS corpus)
- New phenomena at the discourse level:
  - 1. John went to Bill's car dealership to check out an Acura Integra. He looked at it for about an hour.

#### Reference Resolution

- In the previous discourse: John, Bill, Acura Integra, car dealership are all discourse entities.
- Anaphors like he, she, it are referring expressions, e.g. John and he corefer. A group of referring expressions that corefer is called a coreference chain.
- Each discourse entity can refer to one or more entities in the real world.
- Keeping track of discourse entities and relationships between them across multiple sentences is the job of the **discourse model**.

## Types of Referring Expressions

- Indefinite Noun Phrases: specific vs. non-specific indefinites:

  I saw this great looking car today vs. Mary is going to marry a Swede
- Definite Noun Phrases: refers to an existing entity
   I saw an Acura Integra and a Mercedes today. The Integra was white.
   what about: I'm going to take the bus today
- **Pronouns**: locality effects, occurs later in the discourse than the entity it refers to:

I saw an Acura Integra and a Mercedes today. It was white. cataphora: Before he bought it, John test-drove his Acura.

#### Types of Referring Expressions

- **Demonstratives** (also called *deictic* pronouns)

  I like this better than that.
- One Anaphora (one of them)
   I saw six Acura Integras today. Now I want one.
- Inferrables (no explicit discourse entity to refer to)

  I almost bought an Acura Integra today. But a door was dented and the engine was noisy.

### Types of Referring Expressions

- **Discontinuous Sets** (plural referring expressions):

  John has an Acura and Mary has a Mazda. They drive them all the time.
- **Generics** (refer to a class of objects):

  I saw no less than six Acura Integras today. They are the coolest cars.

#### Syntactic and Semantic Constraints on Reference

• Person, Number, Gender and Case agreement. John has a new Acura. It is red.

Syntactic constraints:
 John bought himself a new Acura. [himself=John] (reflexives)
 John bought him a new Acura. [him≠John]

Pleonastic *It*: A pronoun that has no reference:
 It is raining

# Pleonastic *It* detection

It is (CA/JJR   SA/JJR   not) MA/JJ that S	It (is not   may be) (CA/JJR   SA/JJR   not) MA/JJ	
I MV appreciate/believe it if	It MV be (MA/JJ   CV/VBD)	
It is (CA/JJR   SA/JJR   not) CV/VBD that S	It (seemslappears means follows) [that] S	
NP makes finds it MA/JJ [for NP] to VP	It is time to VP	
It is thanks to NP that S	It is (CADV/RB   SADV/RB) adj/JJ	
It (signalslis/VBZ) ?/NNP ?/POS ?/NN	(makes   made) it clear that S	
It is a (CADV/RB   SADV/RB) MA/JJ NP	Would n't it be (CA/JJR   SA/JJR   not) MA/JJ	
It is (CA/JJR   SA/JJR   not) MA/JJ [for NP] to VP		

#### Syntactic and Semantic Constraints on Reference

 These constraints apply in practice to rule out certain coreference possibilities:

John wanted a new car. Bill bought him a new Acura. [him=John] John wanted a new car. He bought him a new Acura. [he=John,him≠John]

Selectional restrictions:

John parked his Acura in the garage. He had driven it around for hours. (not always) John bought a new Acura. It drinks gasoline like a fish.

#### Preferences in Pronoun Resolution

- Recency: John has an Integra. Bill has a Legend. Mary likes to drive it.
- Grammatical Role: subject > existential predicate NP > object > indirect object > nouns in adverbial PP
  - An Acura Integra is parked in the lot. (subject)
  - There is an Acura Integra parked in the lot. (existential predicate NP)
  - John parked an Acura Integra in the lot. (object)
  - John gave his Acura Integra a wash. (indirect object)
  - Inside his Acura Integra, John installed a new CD player. (adv. PP)

#### Preferences in Pronoun Resolution

- Repeated Mention: entities referred to as pronouns are likely to continue being used as pronouns
- Parallelism: (cf. grammatical role)
   Mary went with Sue to the car dealership. Sally went with her to the market.

#### Verb Semantics:

John telephoned Bill. He had lost the pamphlet. John criticized Bill. He had lost the pamphlet.

## Centering Theory and an Algorithm for Pronoun Resolution

- Centering Theory (Grosz et al., 1995) is a theory of local attention and how it changes over time in a discourse
- It makes the claim that a single entity is being *centered* at any given point in the discourse (the point of attention)
- First we represent the discourse within a discourse model, and then we use this representation for pronoun resolution
- Let  $U_n$  and  $U_{n+1}$  represent adjacent utterances in a discourse.

## Centering

- The backward looking center:  $C_b(U_n)$  of utterance  $U_n$  is the entity that is being focused on after  $U_n$  is interpreted.
- The forward looking centers:  $C_f(U_n)$  of utterance  $U_n$  is an ordered list of entities that are possible candidates for  $C_b(U_{n+1})$ .
- The ordering can be one of the preferences given above (e.g. the grammatical role hierarchy) or a combination of preferences.
- $C_b(U_{n+1})$  is defined as the most highly ranked entity in the list  $C_f(U_n)$  (called  $C_p(U_n)$ , the preferred center). The  $C_b$  of the first utterance is undefined.

## Centering

 Centering then defines relationships between utterances as a function of the relation between the backward center and the preferred center

	$C_b(U_{n+1}) = C_b(U_n)$ or undefined $C_b(U_n)$	$C_b(U_{n+1}) \neq C_b(U_n)$
$C_b(U_{n+1}) = C_p(U_{n+1})$	Continue	Smooth-Shift
$C_b(U_{n+1}) \neq C_p(U_{n+1})$	Retain	Rough-Shift

• These transitions provide a theory of text coherence

- The following rules are used by the algorithm:
  - 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 also be realized by a pronoun.
  - 2. Transition states are ordered by preference: Continue > Retain > Smooth-Shift > Rough-Shift.

- The algorithm for pronoun resolution is defined as follows:
  - 1. Generate possible  $C_b C_f$  combinations for each possible set of reference assignments.
  - 2. Filter by constraints, e.g. if some assignments are illegal due to syntactic or semantic constraints remove them from consideration.
  - 3. Rank by transition orderings.

- Consider the following discourse:
  - John saw a beautiful Acura Integra at the dealership.  $(U_1)$
  - He showed it to Bob.  $(U_2)$
  - He bought it.  $(U_3)$
- For sentence  $U_1$  we get:

 $C_f(U_1)$ : {John, Integra, dealership}

 $C_p(U_1)$ : John

 $C_b(U_1)$ : undefined

• For sentence  $U_2$  we have two options for *it*. Option 1:

 $C_f(U_2)$ : {John, Integra, Bob}

 $C_p(U_2)$ : John

 $C_b(U_2)$ : John

Result: Continue  $\Rightarrow C_p(U_2) = C_b(U_2); C_b(U_1)$  undefined

• Option 2:

 $C_f(U_2)$ : {John, dealership, Bob}

 $C_p(U_2)$ : John

 $C_b(U_2)$ : John

Result: Continue  $\Rightarrow C_p(U_2) = C_b(U_2); C_b(U_1)$  undefined

• For sentence  $U_2$  we have two options for *he*. Option 1:

 $C_f(U_3)$ : {John, Integra}  $C_p(U_3)$ : John  $C_h(U_3)$ : John

Result: Continue  $\Rightarrow C_p(U_3) = C_b(U_3) = C_b(U_2)$  – preferred

• Option 2:

 $C_f(U_3)$ : {Bob, Integra}

 $C_p(U_3)$ : Bob

 $C_b(U_3)$ : Bob

Result: Smooth-Shift  $\Rightarrow C_p(U_2) = C_b(U_2); C_b(U_3) \neq C_b(U_2)$ 

### Pronoun Resolution Algorithms

- Centering is one route towards a pronoun resolution algorithm. There are many others including the Lappin and Leass algorithm and the Hobbs Algorithm (see J&M Chp. 18).
- Accuracy is measured in terms of the number of co-reference chains that are recovered correctly.
- Annual competition on co-reference is held as part of the Message Understanding Conference (MUC)

# Dialog Systems

- So far, we have looked at multiple utterance, but not at dialog
- Dialog is different:
  - Turn Taking
     (usually handled using canned text in current dialog systems)
  - Common Ground
  - Conversational Implicature

#### Common Ground

- As conversation proceeds, the speaker and hearer share a common set of information. They also share common world knowledge.
- If there is a problem in reaching common ground, the dialog needs to contain some indicators like **continuers** or **backchannels**.
- Often repeats or reformulations are used in dialog systems to establish common ground:

A: Ok. I'll take the 5ish flight on the night before on the 11th.

B: On the 11th?

### Conversational Implicature

- Scalar implicature: He dresses even worse than Anoop.
- If the dialog system hears: *I want 3 stops in my itinerary.* should it report on flights that have 7 stops? clearly not. why not?
- If the system asks: And on what day would you like to travel? and the user responds: I need to be there for a meeting from the 12th to the 15th

why is the user's response taken to be relevant?

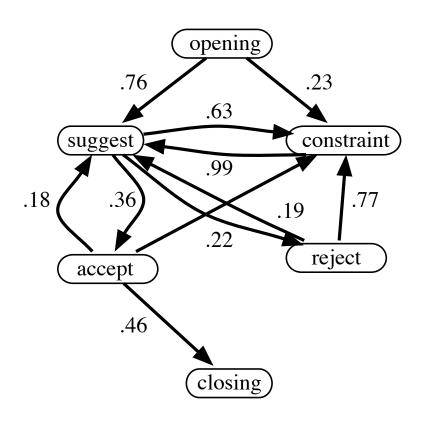
#### Conversational Implicature

- Common inferences in discourse (called Grice's Maxims):
  - Quantity: Be exactly as informative as required rules out certain entailments that usually apply: 3 stops does not mean 7 stops.
  - Quality: your contribution will be assumed to be true.
  - Relevance: your contribution is assumed to be relevant to the current situation. Take the user response to mean the 11th.
  - Manner: do not repeat yourself if you know something exists in the common ground.

## Dialog Systems

- Dialog systems have to choose between speech acts (dialog acts)
  - Assertives: committing the speaker to a fact. e.g. suggesting, concluding
  - Directives: try to get the hearer to do something. e.g. asking, ordering, requesting
  - Commissives: try to get the hearer to commit. e.g. promising, planning, opposing
  - Expressives: express a psychological state. e.g. thanking, apologizing
  - Declarations: change the state of the common ground. e.g. reserve a flight, name something

# Conversation Management in Dialog Systems



Dialog Act Planning using an HMM