

LING 120:
Language and Computers
Semester: Fall '17

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Outline for today

- ▶ Dialog Systems - Design (continued)
- ▶ Evaluating Dialog Systems
- ▶ Friday: Conclusion of dialog systems, and overview of Speech recognition.

Dialog Systems - What we discussed so far?

- ▶ What are dialog systems?
- ▶ Where are they useful?
- ▶ What are the different kinds of dialog systems?
- ▶ How are they created?
- ▶ What are the aspects of dialogues these systems should take care of while chatting with a user?

Monday's exercise

3. **ALL:** We claimed that dialog can be seen as a game, and drew an analogy to basketball. How far does this analogy go? In this exercise, we want you to push the analogy as far as you can. You might want to consider some of the following concepts, most of which seem to us to have interesting equivalents:

- Playing as a team (and its converse, playing selfishly).
- Committing so many fouls that you get ejected.
- Doing sneaky fouls behind the referee's back.
- Man-to-man coverage and zone defense.
- Misdirection and disguise.
- Tactics and strategy.
- Alley-oops and slam dunks.
- Free throws.
- Working the referee.
- Running out the clock.

Write up your ideas about how some of these concepts map onto dialog (or think up new ones of your own and map them). You should give specific examples of how a dialog could match each situation. We do not promise that all our items make sense, since we intentionally put in a few strange ones to challenge your imaginations.

Summary of Monday's responses

- ▶ committing so many fouls you get ejected: giving rude responses until the other person quits the conversation.
- ▶ running out the clock: rambling about random things
- ▶ playing as a team: people should co-operate for smooth flow of conversation, lecture vs dialog
- ▶ doing sneaky fouls behind the referees: backhanded compliments
- ▶ mis-direction and disguise: misleading a conversation, lying with others in the conversation
- ▶ tactics: staying away from touchy subjects

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- ▶ What is a Wizard of Oz simulation?

Another Example of Dialog System Development

Interactions - <https://www.interactions.com/> - came with the idea of human-assisted dialog systems

- ▶ The idea is to have a human in the loop to improve the accuracy of dialog systems.
- ▶ i.e., not fully automated, but automation with human support
- ▶ (does that sound like a step backward? or a case of sensible implementation?)

Adaptive Intelligence technology videos

(<https://goo.gl/aTVFk3>, <https://goo.gl/LP9re7>)

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- ▶ Even before the bot starts interacting with customers, how can I evaluate it during development?
- ▶ As it turns out, this question has no easy answer!

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- ▶ If possible response vocabulary is small, we can evaluate based on word-overlap between machine generated, and human generated response for the same question.

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Uses text classification, our previous topic!

- ▶ ADEM: Train a classifier on a set of responses in context, which are labeled as appropriate or inappropriate for the context by humans. You then use this classifier to evaluate responses of the dialog system.

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Attendance Exercise

Go to the canvas forum, take a look at the uploaded file and work in groups of 2–3 people to answer the questions in the file.