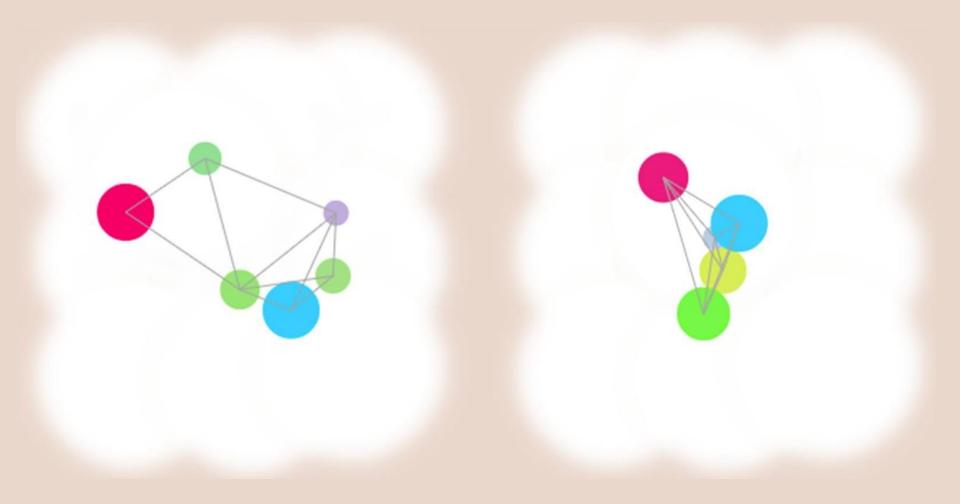
Cognitive Belief Modeling for Naturalistic Dialog Management

> Eric Saund, Ph.D.\* Saund Laboratories

\*This work conducted at the Palo Alto Research Center

## Conversation



## **RE: Basic Conversational Competence**

User: Alexa, when is the Superbowl?

Alexa: Superbowl fifty-two will be on NBC on February fourth at three-thirty PM. The teams competing are yet to be determined.

User: Alexa, is that a Sunday?

Alexa: Sorry, I don't know that one.

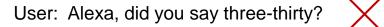


User: Alexa, repeat that.

User: Alexa, repeat that more slowly.

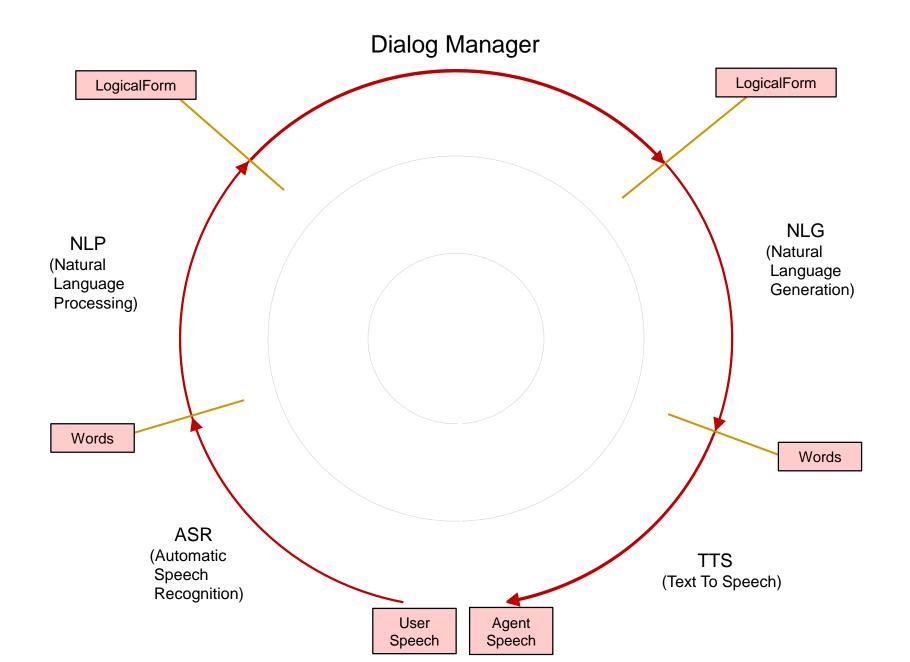


User: Alexa, what time did you say?

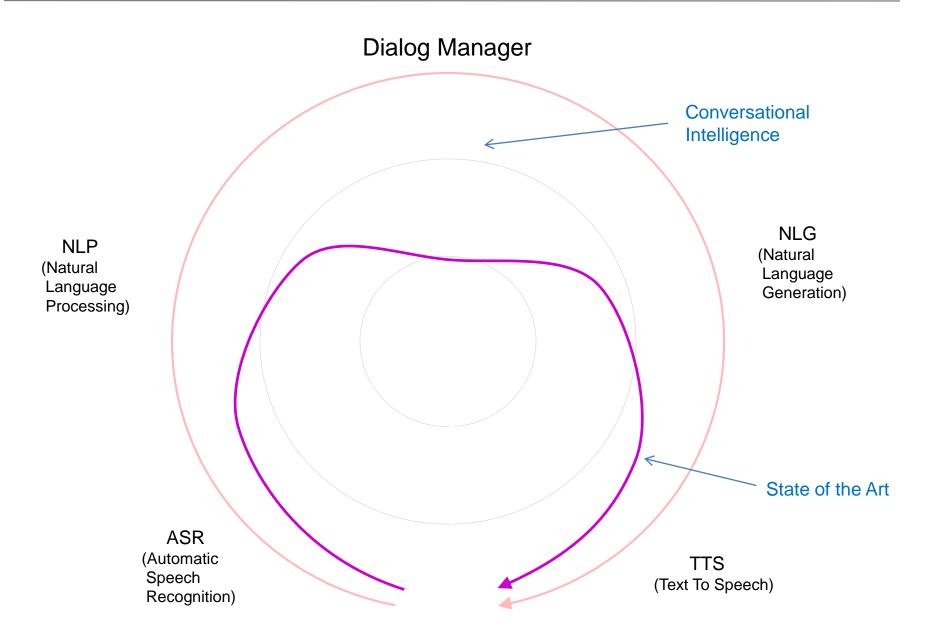




## Radar Map: Conversational Agent Architecture



## State of the Art in Conversational Agents

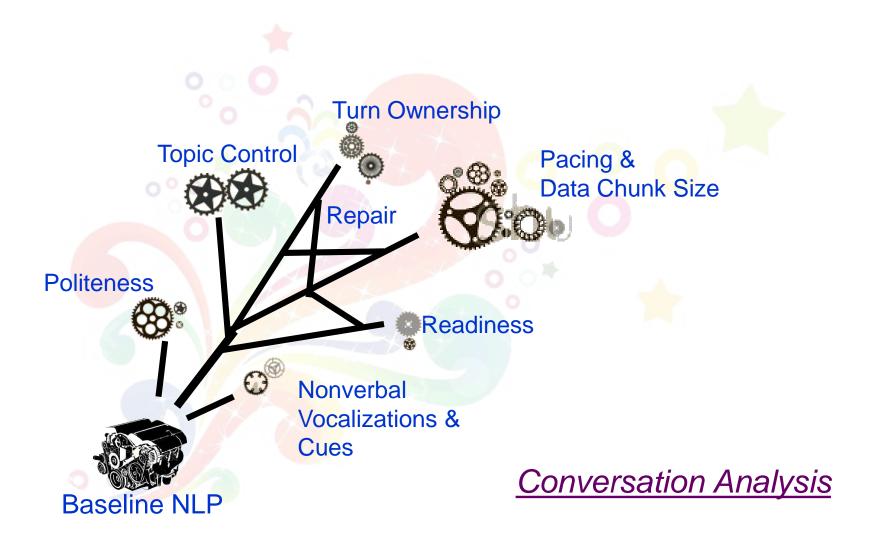


## Natural Conversation



## **Natural Conversation**

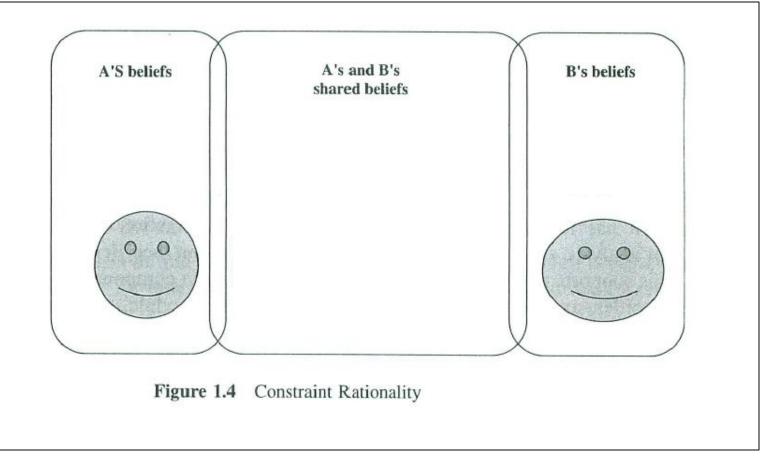




## Simple Task: Communicate Structured Data

- U: what is the telephone number?
- A: area code six five zero
- U: six five zero
- A: five nine two
- U: sorry, did you say five nine three?
- A: no. it's five nine two
- U: okay. what comes after that?
- A: the line number is zero five nine seven
- U: zero five
- A: nine seven
- U: okay, got it
- A: we're all done

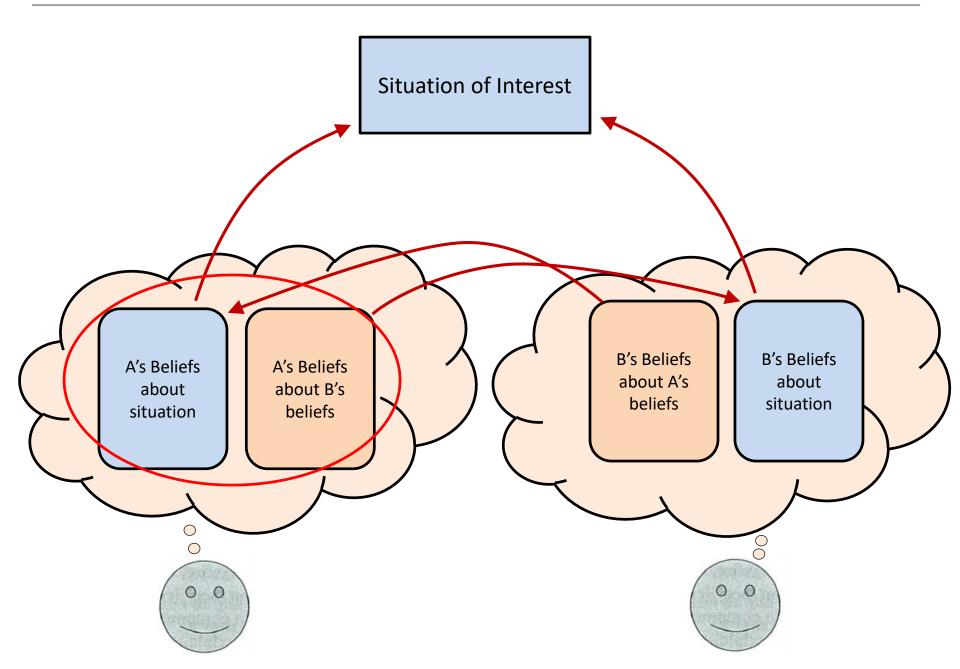




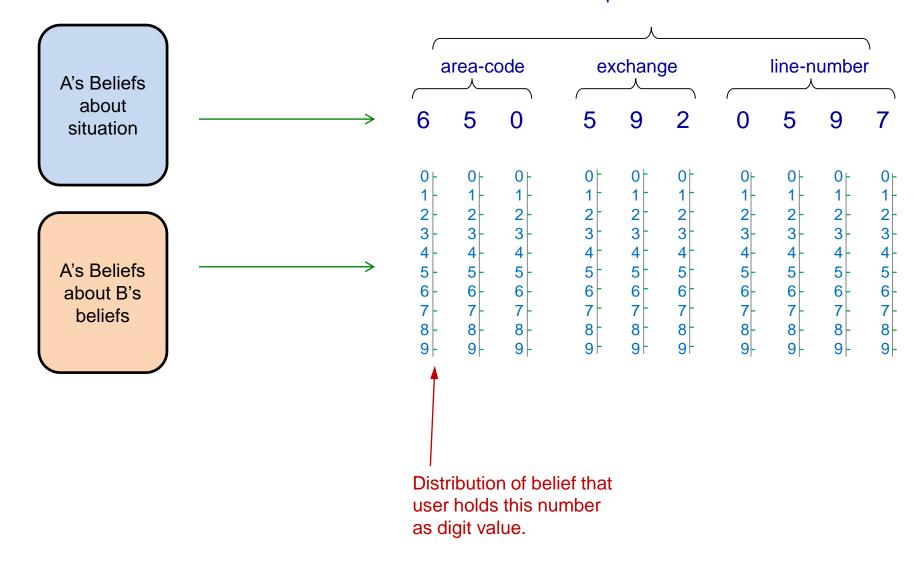
K. Jokinen, "Constructive Dialog Modeling", 2009

H. Clark, 1985 (psycholinguistic theory) D. Traum, 1993+ (in dialog managers) E. Horvitz, 1998+ N. Goodman, 2016+

## **Cognitive Belief Modeling**

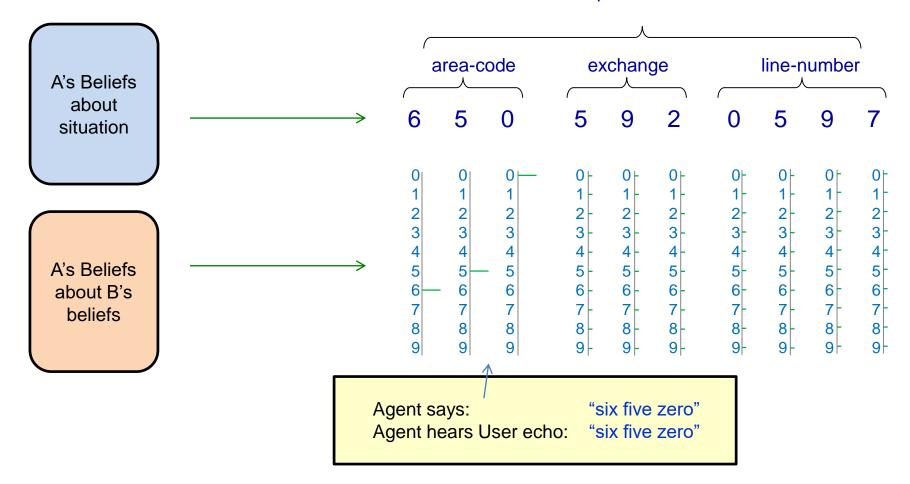


## Modeling Belief About User's Knowledge of Telephone Number



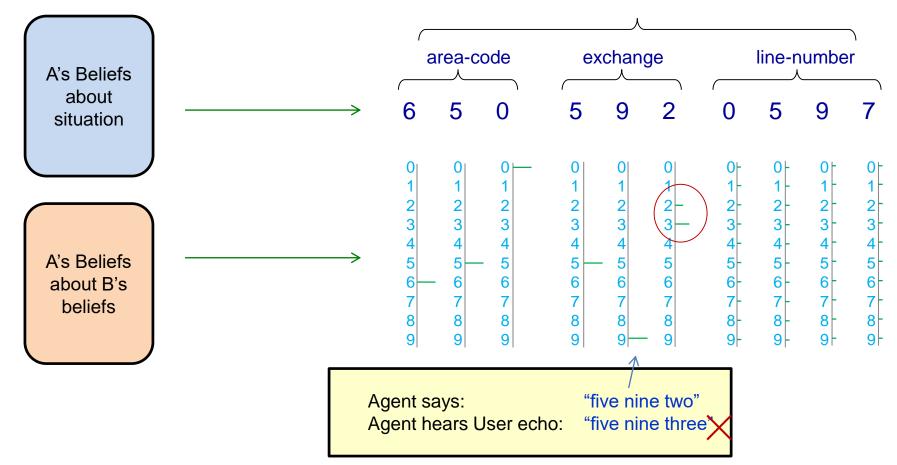
#### telephone number

## Modeling Belief About User's Knowledge of Telephone Number



#### telephone number

## Modeling Belief About User's Knowledge of Telephone Number

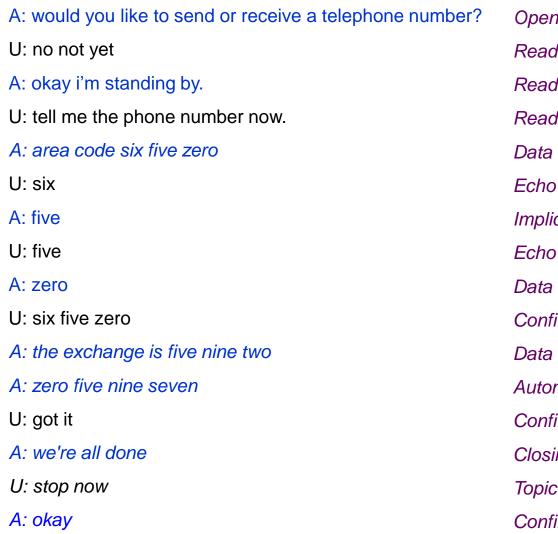


#### telephone number

Similarly for...

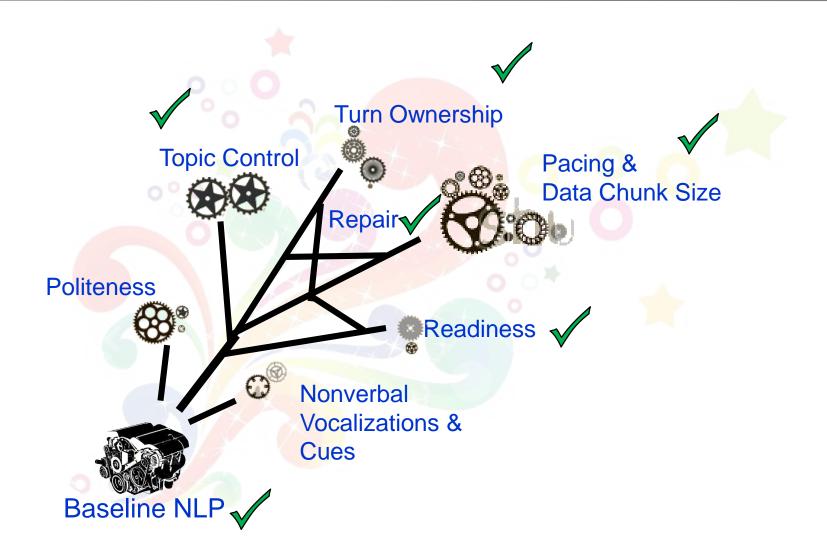
- Readiness
- Turn Ownership
- Chunk Size

### Conversational mechanics in communicating structured data.

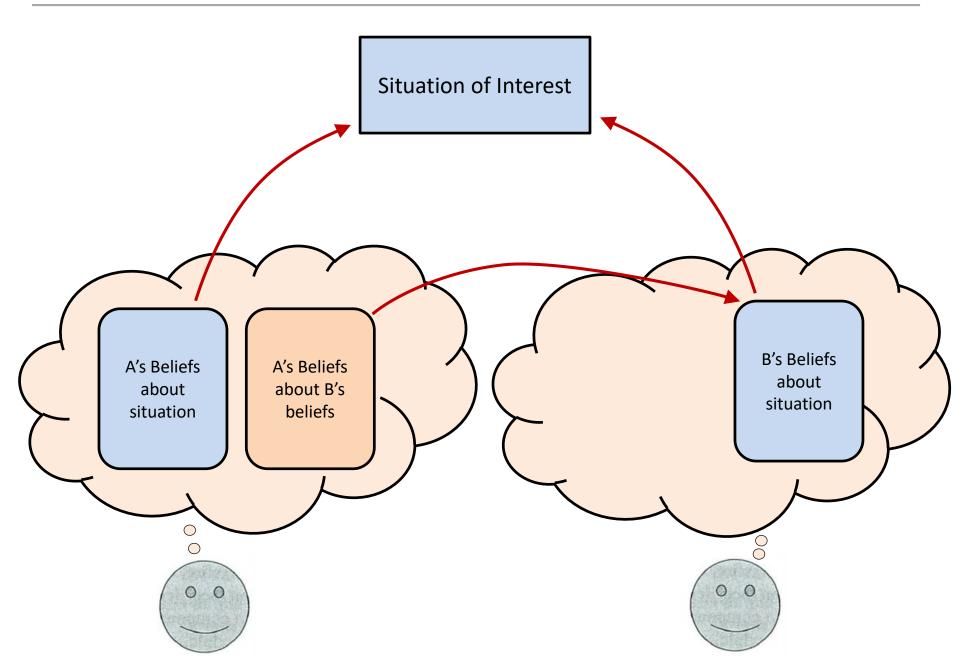


Opening Readiness Readiness Readiness, topic control Data index + data values Echo repeat check, signal chunk size Implicit confirmation; adjust chunk size Echo repeat check check Data value Confirmation check, signal chunk size Data index + values, readjust chunk size Automatic retake of turn ownership Confirmation Closing Topic control Confirmation of topic control

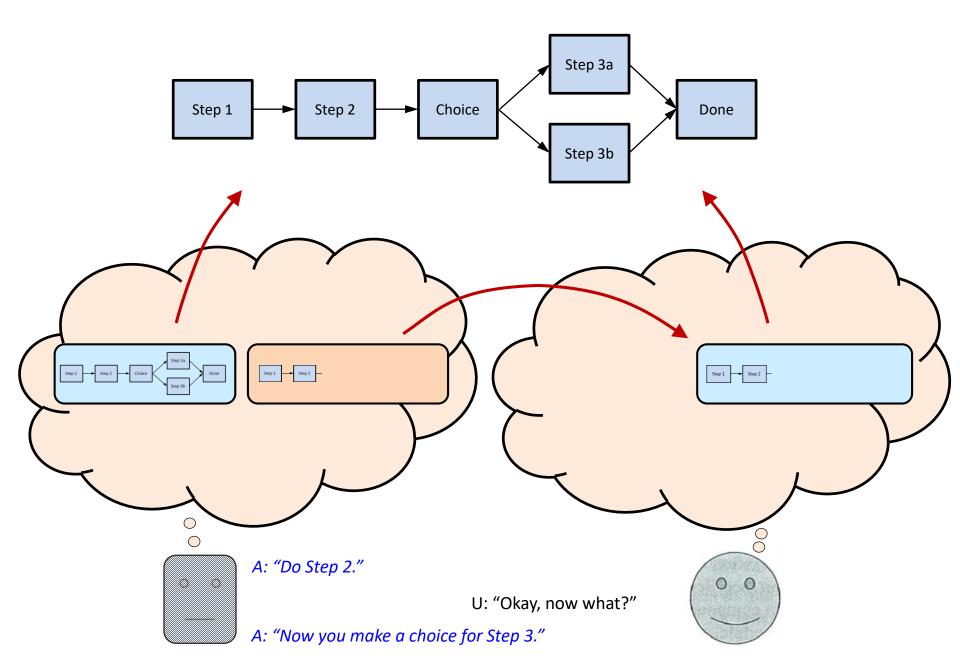
# Naturalistic Dialog about Structured Data through Cognitive Belief Modeling

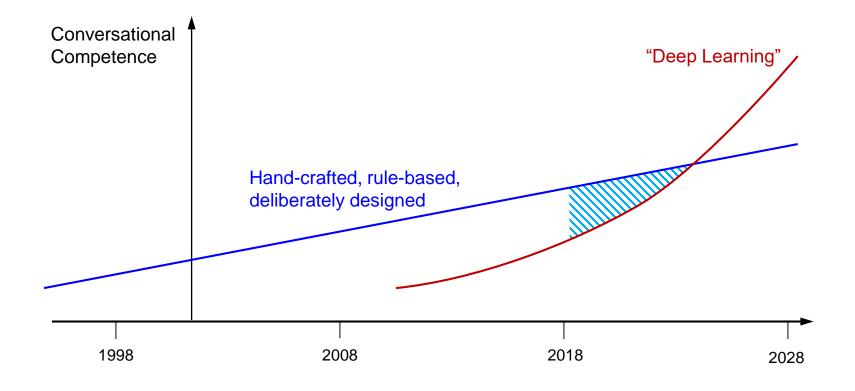


## **Structured Domains**



## Structured Domains: Task Workflow





\*Practical: • task-constrained

- small reference/training data sets
- predictable engineering
- debuggable

(fin)