

# IMPROVISATIONAL COMPUTATIONAL STORYTELLING IN OPEN WORLDS

#### Lara J. Martin

Brent Harrison
Mark O. Riedl
{lara.martin, brent.harrison, riedl}
@cc.gatech.edu



### IMPROVISATIONAL





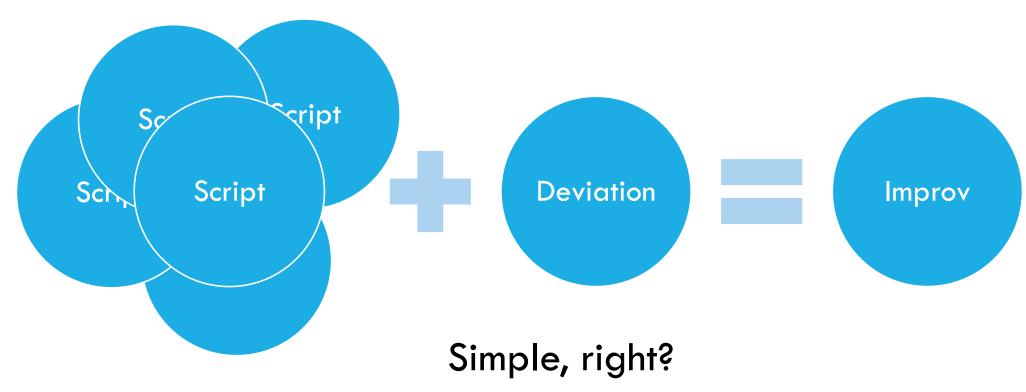
#### WHAT THE HECK DID WE JUST SEE?

The American version of the show Whose Line Is it Anyway? Season 3, Episode 8

Sure, but...

- They're building a story.
- They're reinterpreting the surgery theme by adding a spy and a Film Noir feel.
- They're building up and playing off of our and each others' expectations.
- But also, they're making (occasionally humorous) responses that break our expectations.

#### I GIVE UP. HOW DO THEY DO IT?





#### HUMANS CAN DO IT. SO WHY CAN'T COMPUTERS?

- It takes a lot of expertise.
- Computational systems tend to be experts in a single area.
- •The response needs to be quick (real-time).



### OPEN WORLDS



#### OUR DEFINITION OF AN "OPEN WORLD"

All possible
thoughts a
human can think
of and express
through
language



## OKAY, SO IT'S HARD. BUT AT LEAST WE'RE NOT STARTING FROM SCRATCH...?



# COMPUTATIONAL STORYTELLING



#### INTERACTIVE NARRATIVE

```
ZORK I: The Great Underground Empire Infocom interactive fiction — a fantasy story
Copyright (c) 1981, 1982, 1983, 1984, 1985, 1986 Infocom, Inc.
All rights reserved.
ZORK is a registered trademark of Infocom, Inc.
Release 52 / Serial number 871125 / Interpreter 8 Version J

West of House
You are standing in an open field west of a white house, with a boarded front door.
There is a small mailbox here.
```



- + Computational
  - + Storytelling
- Improvisational
  - Open World



- + Computational
  - + Storytelling
- + Improvisational
  - Open World



#### NOW LET'S MAKE IT AN OPEN WORLD!





#### IMPROVISATIONAL STORYTELLING



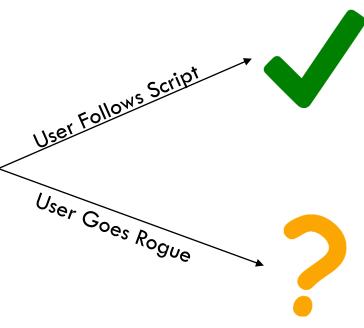




Improv Theater



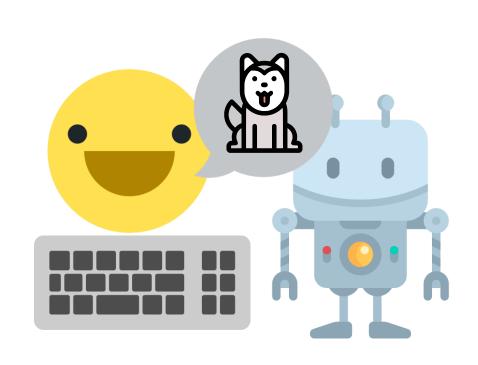
```
West of House
                                                     0/0
ZORK I: The Great Underground Empire Infocom interactive fiction - a fant
    yřight (c) 1981, 1982, 1983, 1984,
5, 1986 Infocom, Inc.
            ts reserved.
            a registered trademark of
Release 52 / Serial number 871125 /
Interpreter 8 Version J
West of House
You are standing in an open field west of a white house, with a boarded front
door.
There is a small mailbox here.
>_
```

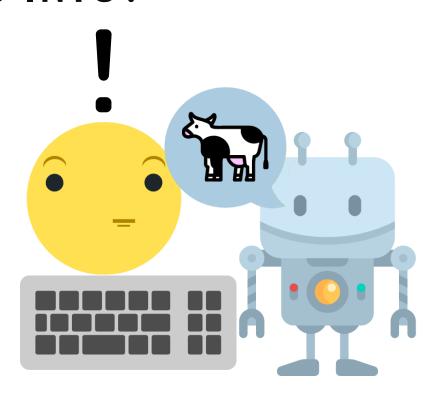


"Interactive Script"



#### WHAT DID WE GET OURSELVES INTO?







#### WE HAVE A PLAN.

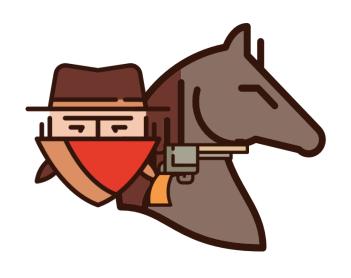


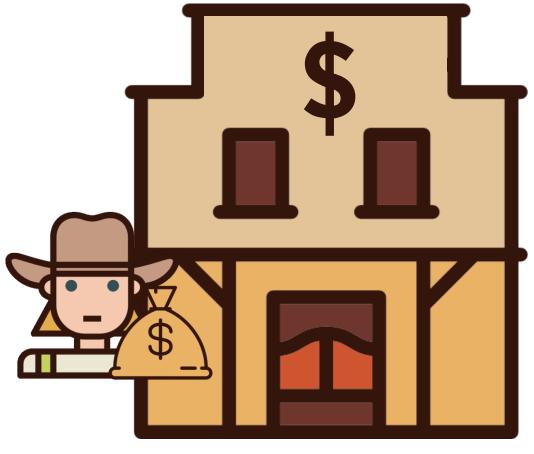
#### HOW DO WE HANDLE HUMANS?

- 1. We have to assume that the user has a set of scripts, like improv actors.
- 2. Depending on what the human does, the agent chooses the appropriate actions based off of 3 strategies:
  - Constituent
  - Consistent
  - Exceptional



#### THE SETUP







# HOW IT SHOULD END



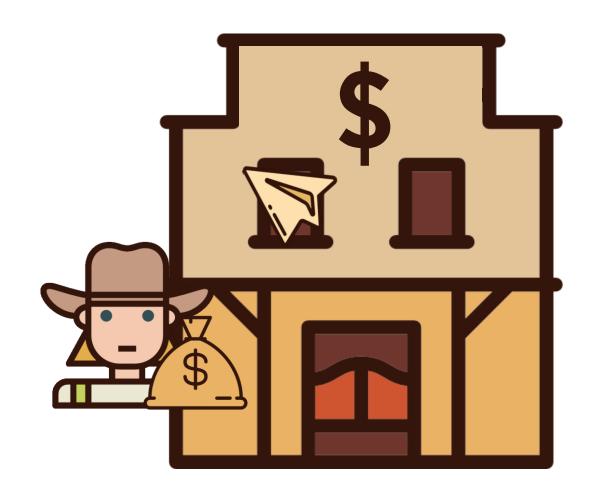
# **CONSTITUENT (SAME)**



#### CONSISTENT

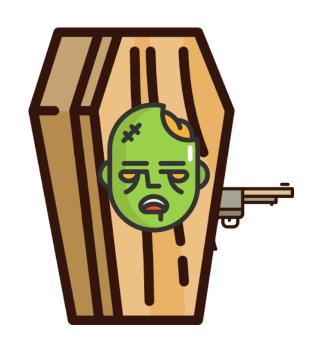


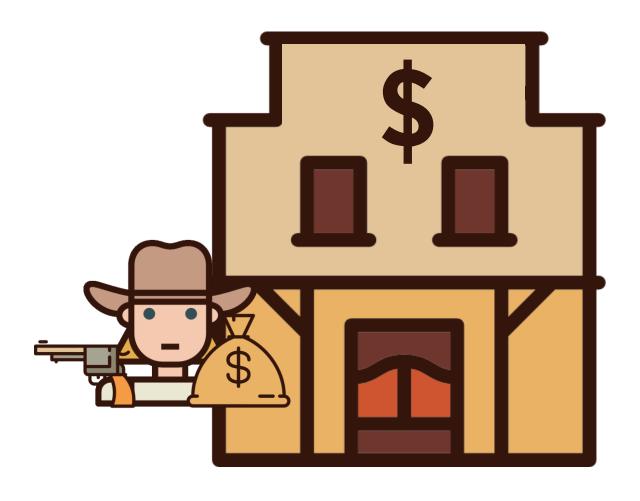






#### **EXCEPTIONAL**



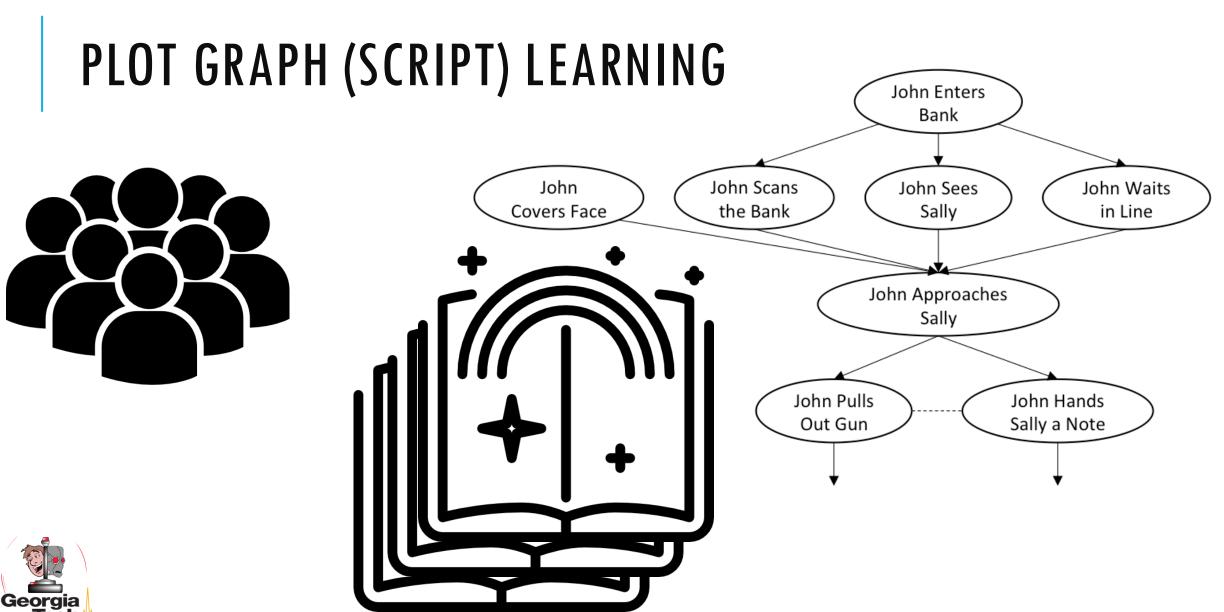




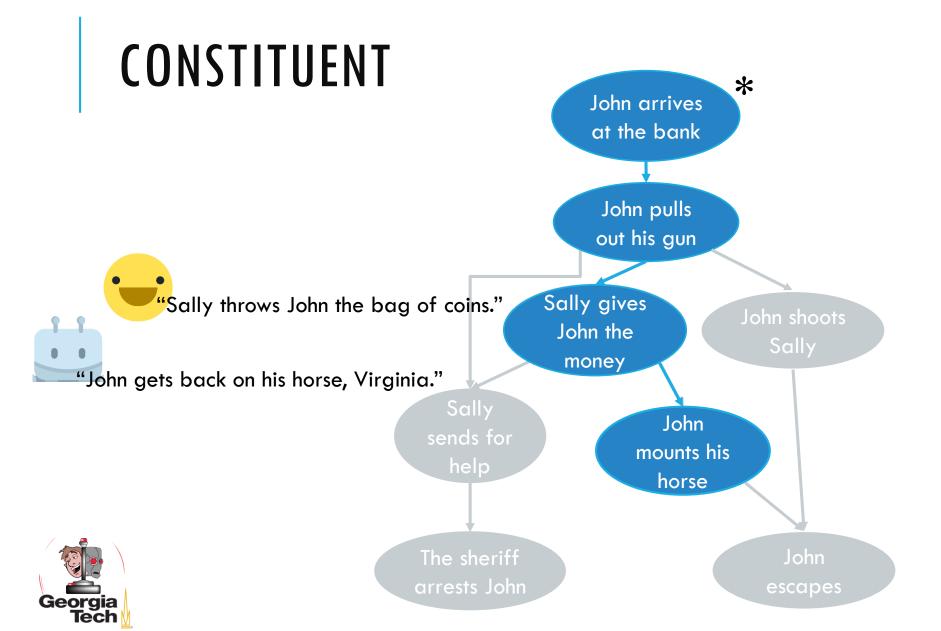


#### GRAPH-BASED REPRESENTATION

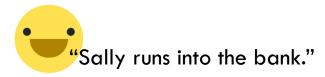




#### OUR GENERAL FRAMEWORK Agent Response History Constituent Scripts World Knowledge Consistent Exceptional User Turn Representation

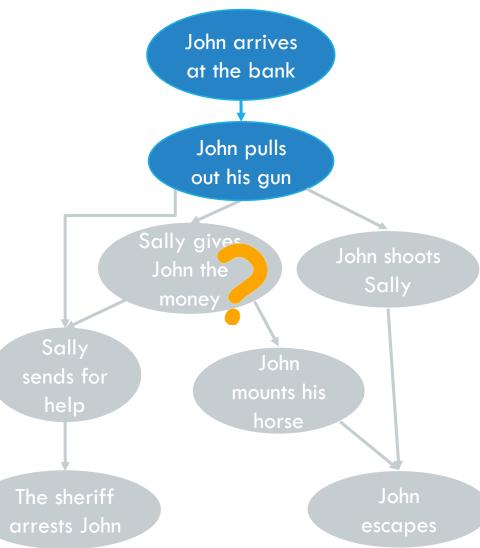


#### CONSISTENT

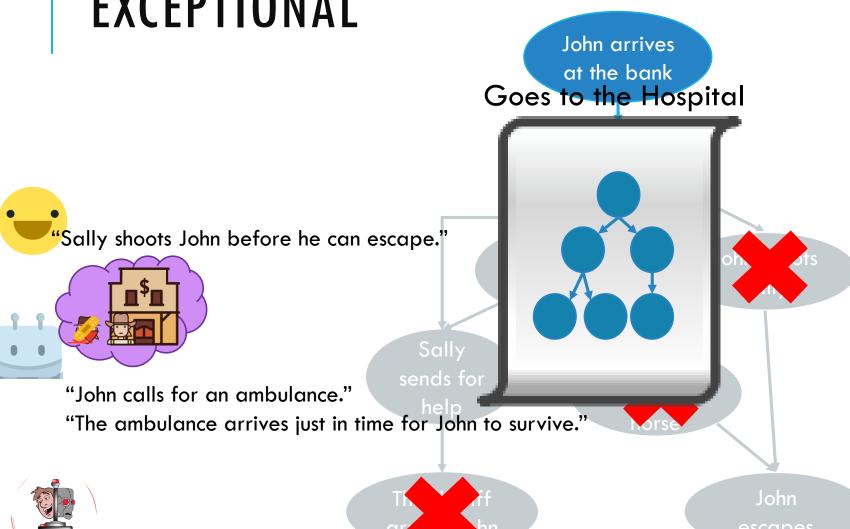








#### **EXCEPTIONAL**



#### GRAPH-BASED REPRESENTATION

#### Pros

- Clear story flow
- Can have multiple scripts
- Can be acquired from just a few special stories

#### Cons

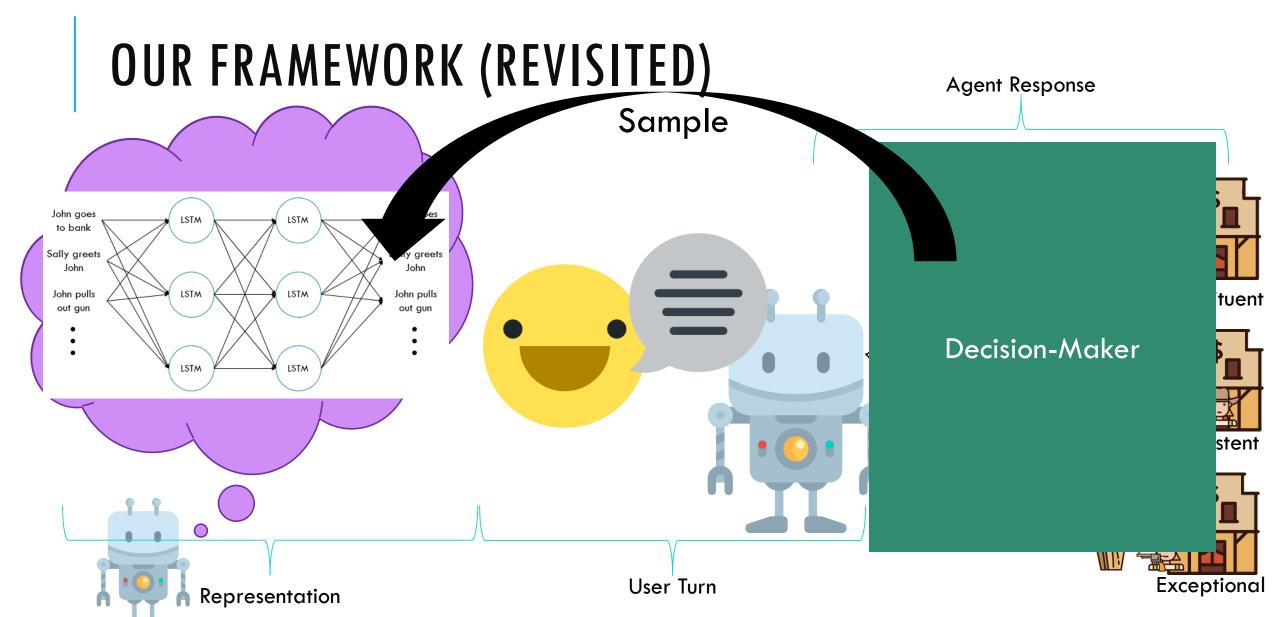
- Crowdsourced separately for each genre
- Script might not be ideal (matching user, boring, etc.)
- Awkward transitioning between scripts
- Relignt on sentential NLP





#### NEURAL NET REPRESENTATION





#### NEURAL NET REPRESENTATION

#### Pros

- Self-learning internal "memory"
- Transitions easily between genres
- Can use any stories

#### Cons

- Need a lot of stories
- •Don't know what goal/objective function to optimize for (surprisal, consistency, etc.)
- Hard to see why an agent makes certain decisions



#### WHY ARE WE DOING THIS?

- It's fun!
- Serious games for training (forensics, strategists)
- Problem-based inquiry educational games (open-ended problem-solving)
- Integration into conversational agents to appear more human
- A glimpse into cognitive processes of human improv



#### DISCUSSION

- This is not a solved problem. Are we covering all possible scenarios for how a story can unfold?
- What kind of data should we be training on? Can it scale?
- What does it mean for a story to be considered "good" or "entertaining"?
- How "creative" can we be before things get weird?



#### Thank you!

Lara J. Martin
Ijmartin@gatech.edu
Iaramartin.net







-lcons taken from flaticon.com and adapted for this presentation. "Whose Line" video cut from https://youtu.be/XmnZ9HZTHjw