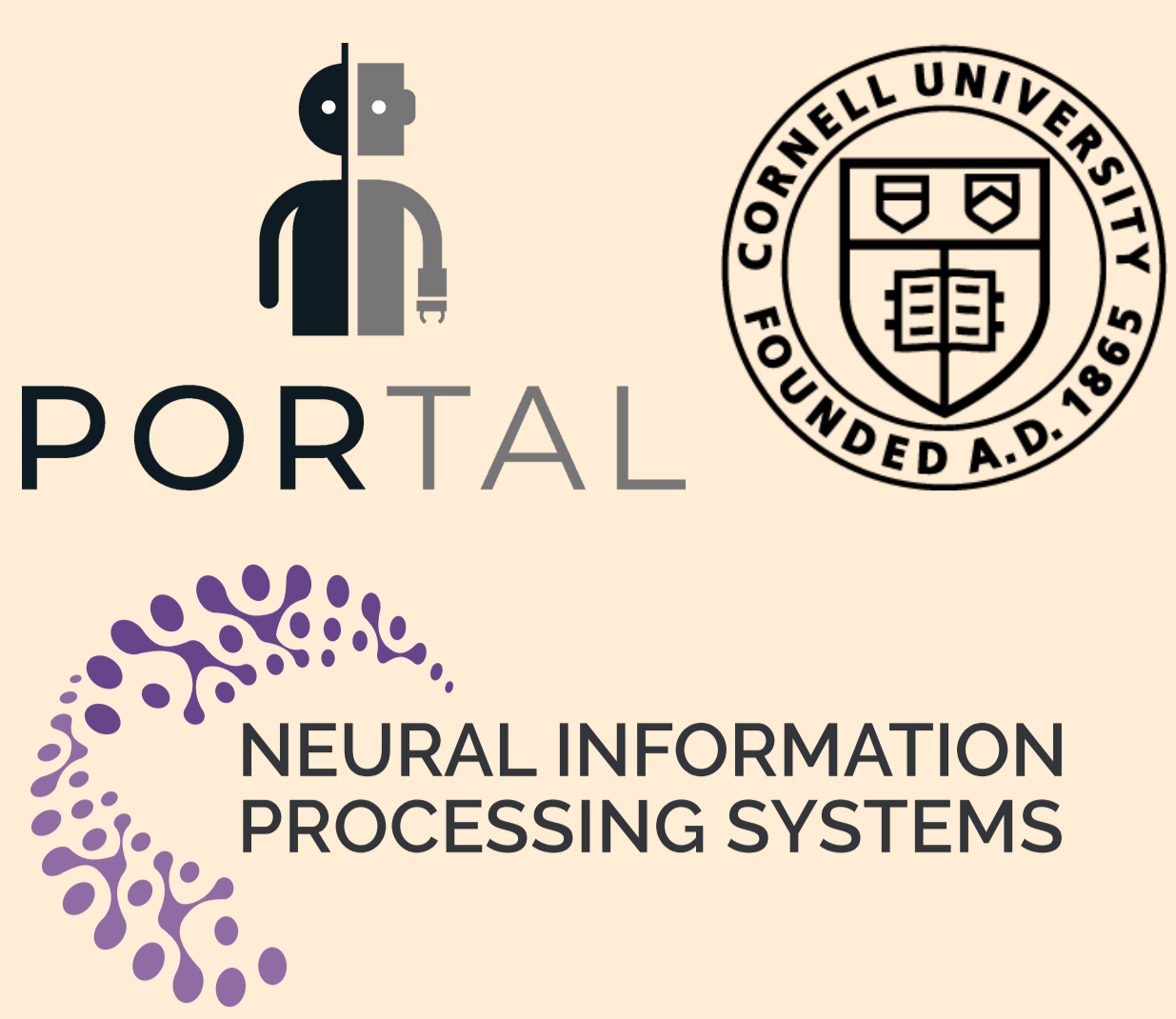




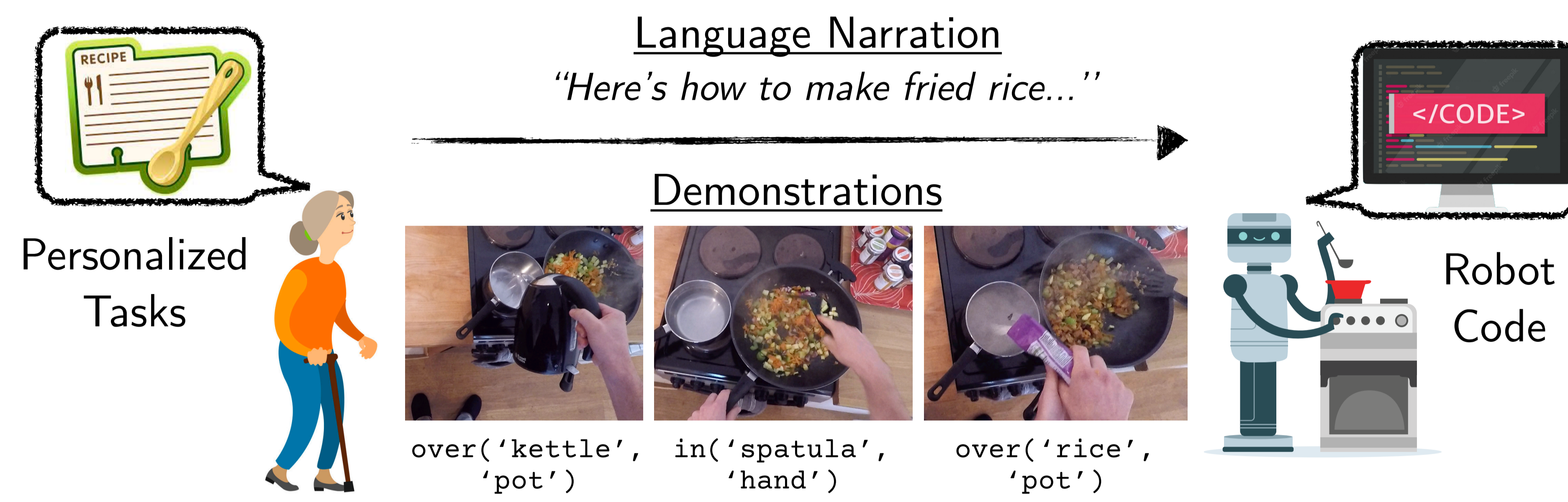
# Demo2Code:

## From Summarizing Demonstrations to Synthesizing Code via Extended Chain-of-Thought

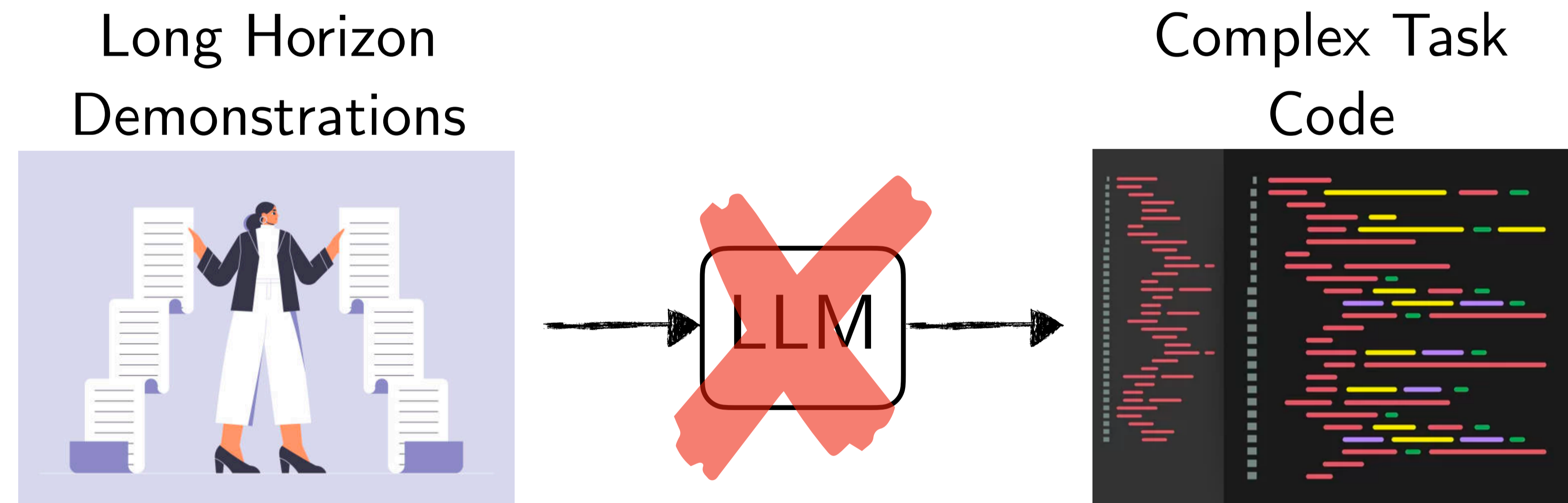
Huaxiaoyue Wang, Gonzalo Gonzalez-Pumariega, Yash Sharma, Sanjiban Choudhury  
Cornell University



### Generate Robot Code From Demonstration

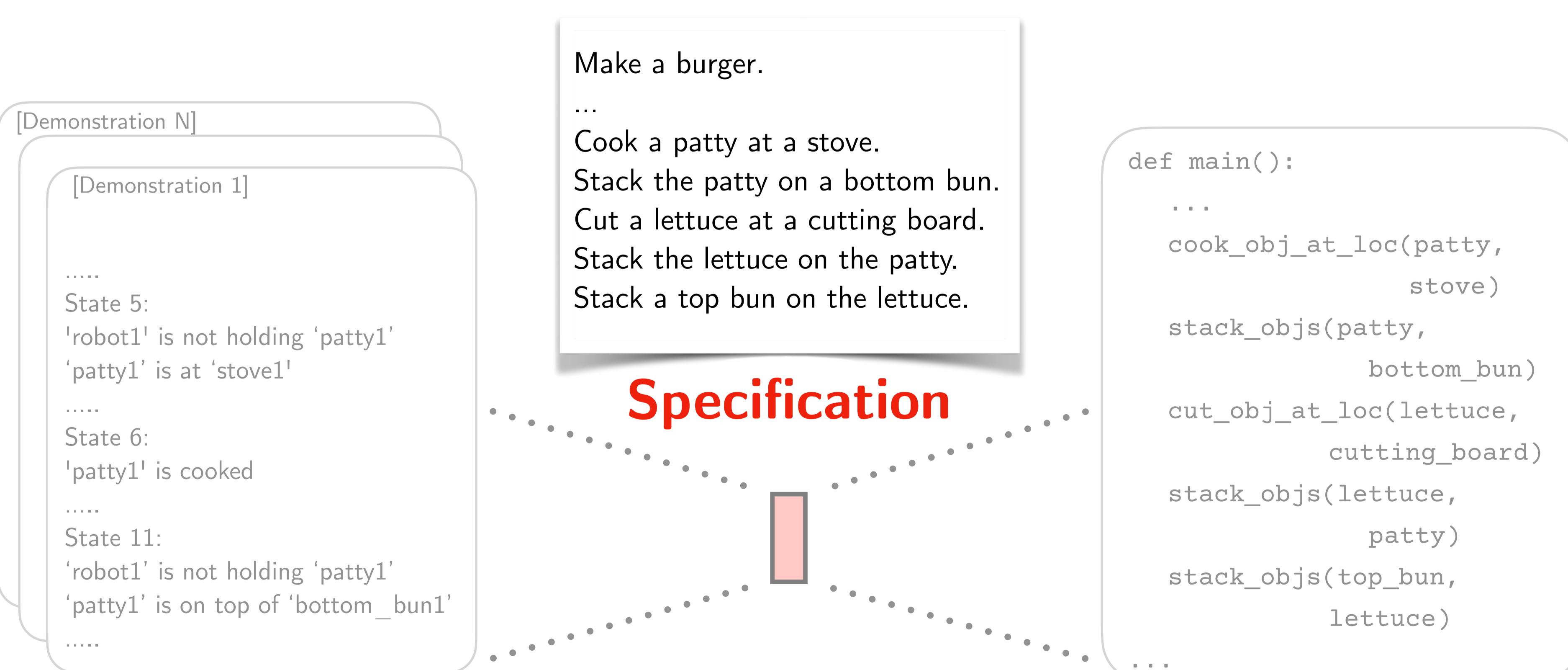


### Challenges



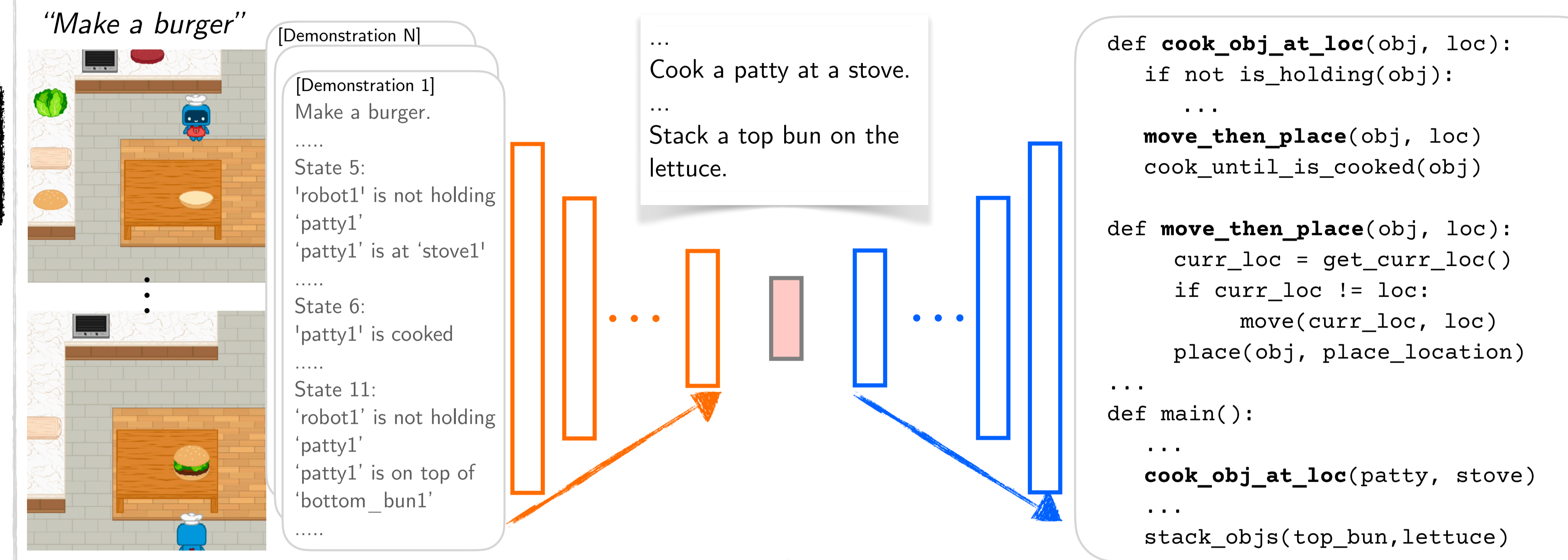
Directly generating code from demonstrations is intractable!

### Key Insight



Both demonstrations and code are connected by a latent **task specification**.

### Our Approach: Demo2Code



#### Stage 1

**Recursively summarize**  
demo → specification

Recursively summarizes each demo, then concatenates all summaries to generate a **task specification**

#### Stage 2

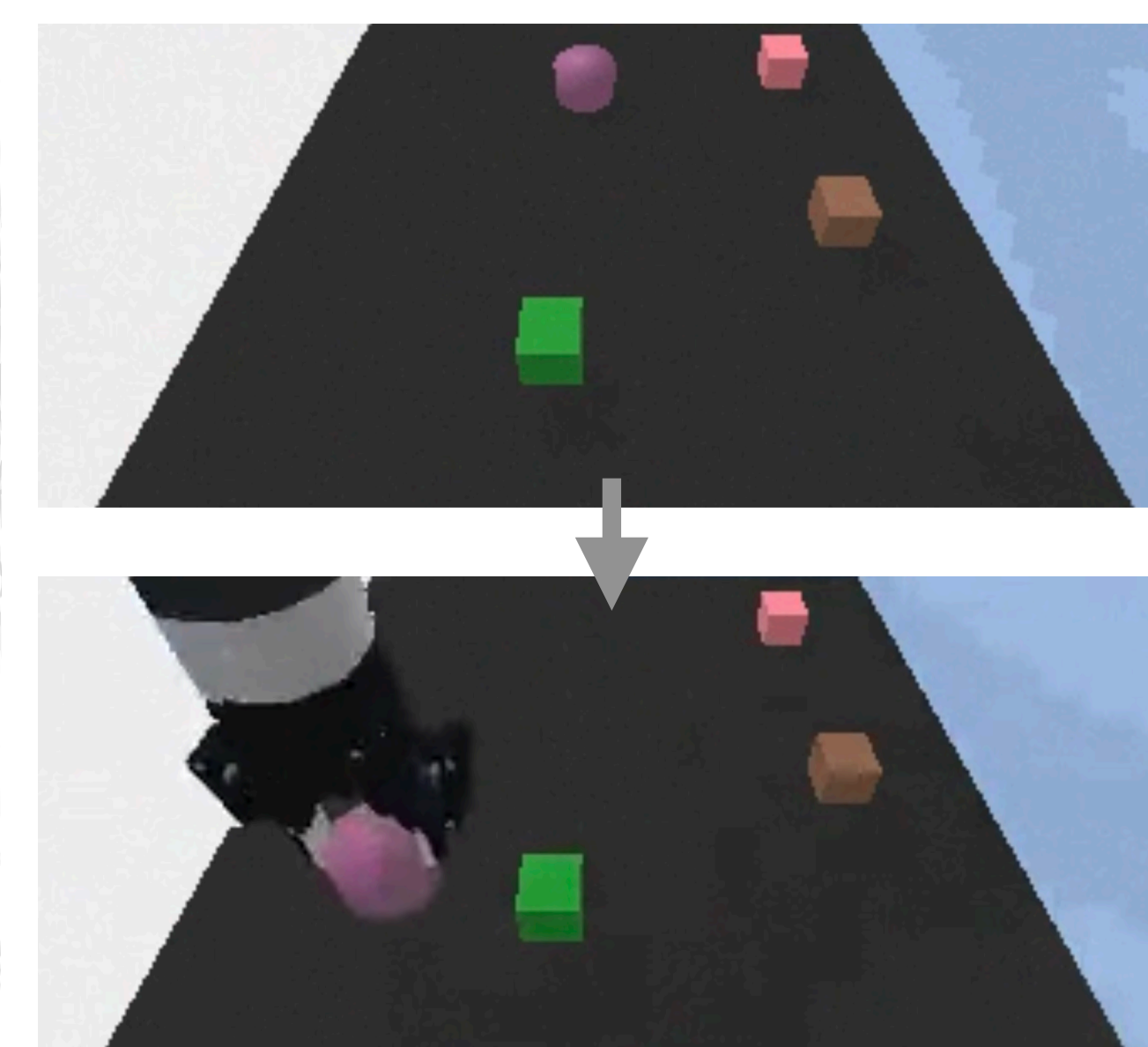
**Recursively expand**  
specification → task code

From the **task specification**, generates high-level code, then recursively defines helper functions

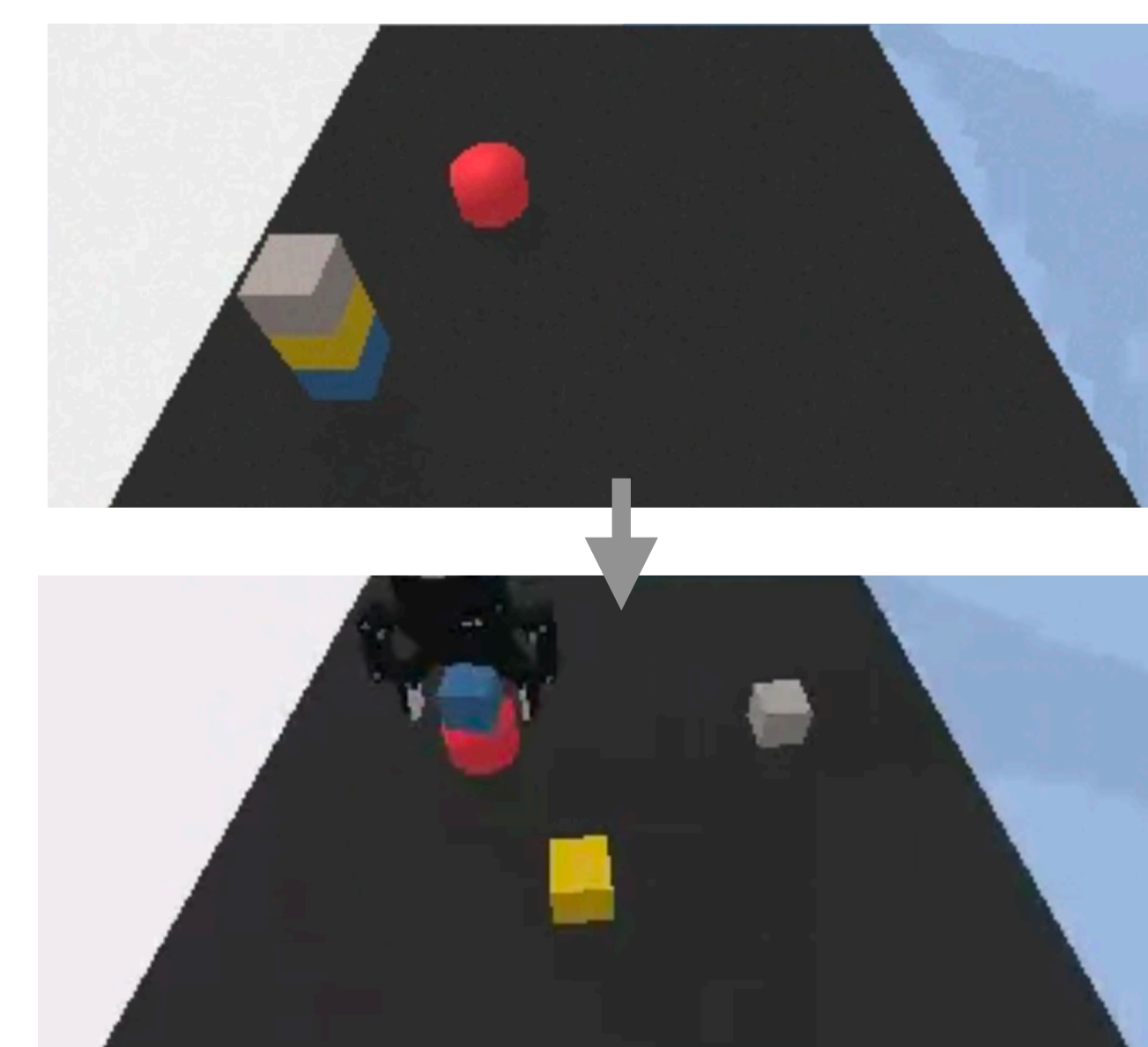
### Tabletop Manipulation

- ✓ when the language **lacks specificity**
- ✓ when the world has **hidden constraints**
- ✓ when the user has **personal preferences**

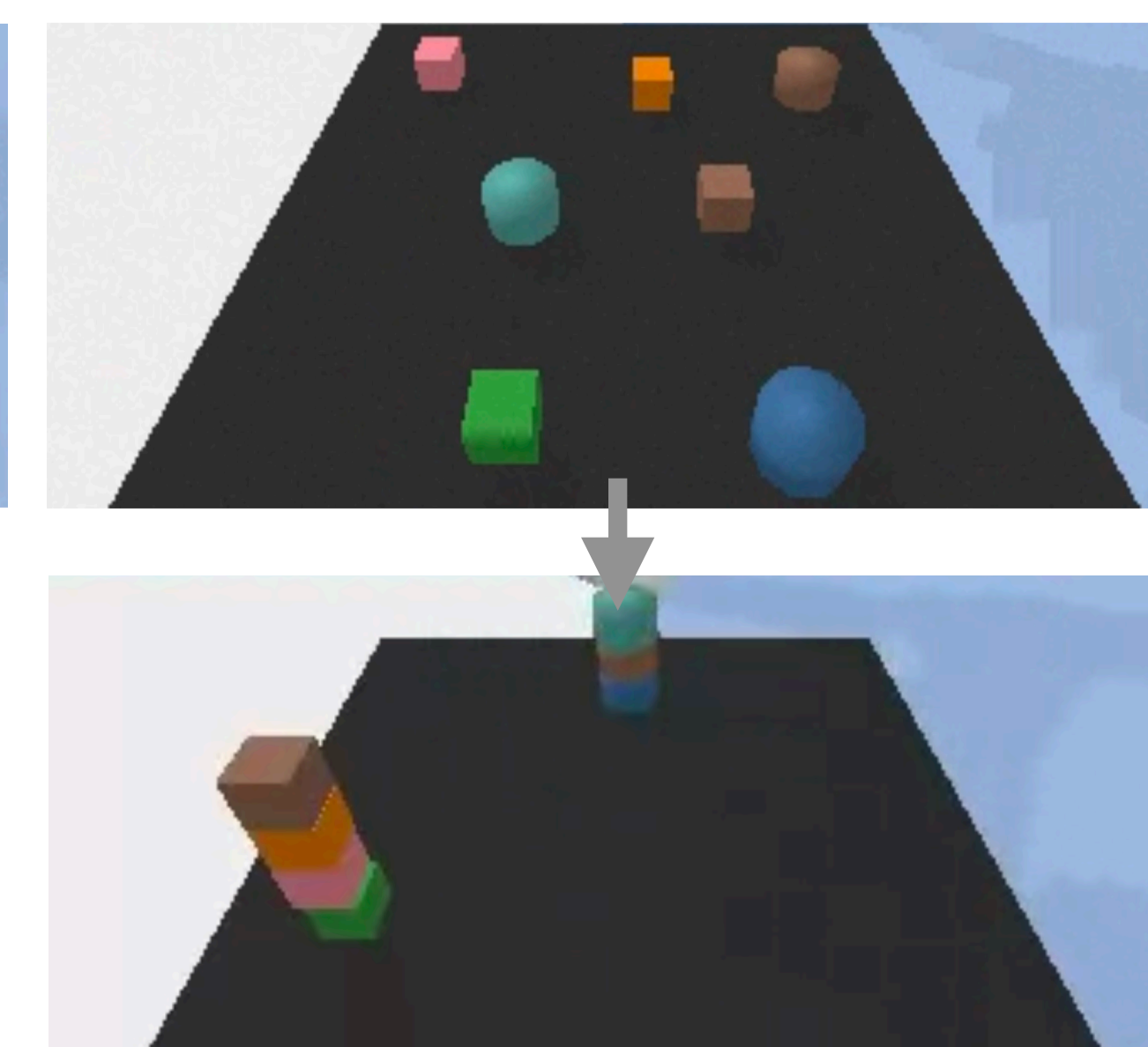
"Place the purple cylinder to (the left) of the green block."



"Place the blue block on top of red cylinder." (but blocked by gray and yellow)



"Stack all objects into two stacks." (one stack has only blocks, other only cylinders)

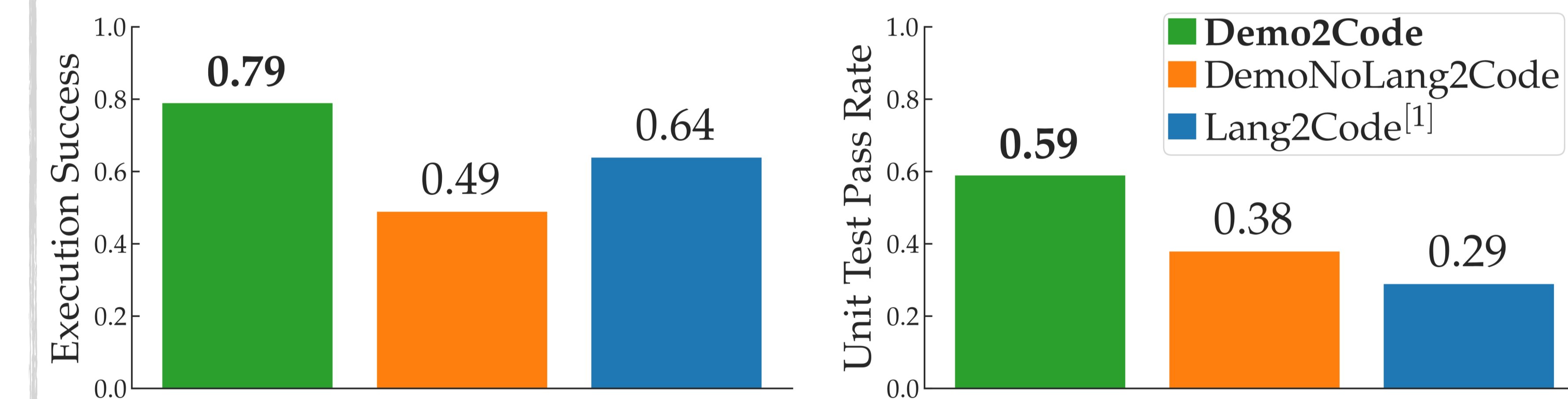


### Novel Kitchen Game: *Robotouille*

- Open-source game!
- Procedurally generated environments
- Easy to customize (new assets, tasks, actions, etc.)



Demo2Code generalizes to unseen, more complex tasks



[1] Jacky Liang, et al. Code as policies: Language model programs for embodied control. arXiv preprint arXiv:2209.07753, 2022.

### Real World Dataset: EPIC-Kitchens

User 22: Prefers soaping all first then rinsing all objects

objs = get\_all\_objs()

```
for obj in objs:
    soap(obj)
    place(obj, "sink_2")
    turn_on("tap_1")
    turn_off("tap_1")
for obj in objs:
    rinse(obj)
    place(obj, "dishrack_1")
    turn_off("tap_1")
```

User 30: Prefers soaping then rinsing each object

objs = get\_all\_objs()

```
for obj in objs:
    pick_up(obj)
    go_to("sink_1")
    turn_on("tap_1")
    soap(obj)
    rinse(obj)
    turn_off("tap_1")
    place(obj, "counter_1")
```