

Programming by Demonstration with Situating Semantic Parsing

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Programming by Demonstration



- Teaching the robot new skills
- Kinesthetic demonstrations
- Natural language interface

Semantic Parsing

at the chair, move forward three steps past the sofa


$$\lambda a. pre(a, \iota x. chair(x)) \wedge move(a) \wedge len(a, 3) \wedge$$
$$dir(a, forward) \wedge past(a, \iota y. sofa(y))$$

Situated Semantic Parsing

“close left hand”



$\lambda a.close(a) \wedge patient(a, \mathcal{A}(\lambda x.hand(x) \wedge left(x)))$

close-left-hand

Situated Semantic Parsing

“close”



$\lambda a.close(a)$



close-right-arm
close-right-hand
close-action
close-left-hand

...

?

Situated Semantic Parsing

“close”



Use the system state to
disambiguate

$\lambda a.close(a)$

close-right-arm
close-right-hand
close-action
close-left-hand

...

Situated Semantic Parsing

“close”



Use the system state to disambiguate

- The close action can only be applied to hand objects

$\lambda a.close(a)$

~~close-right-arm~~
~~close-right-hand~~
~~close-action~~
close-left-hand

...

Situated Semantic Parsing

“close”



Use the system state to disambiguate

- The close action can only be applied to hand objects
- Infer salient objects from recent actions

$\lambda a.close(a)$

~~close-right-arm~~
close-right-hand
~~close-action~~
~~close-left-hand~~

...



Situated Semantic Parsing

“close”



Bi-modal interaction

Verbal
Instruction

Physical
Manipulation

$\lambda a.close(a)$

Robot
command

~~close-right-arm~~
close-right-hand
~~close-action~~
~~close-left-hand~~

...