

# Introduction to Planning

**COURSE: CS40002**

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# Outline

- ❑ **Planning versus Search**
- ❑ **Representation of planning problems**
  - **Situation calculus**
  - **STRIPS**
  - **ADL**
- ❑ **Planning Algorithms**
  - **Partial order planning**
  - **GraphPlan**
  - **SATPlan**

# The Planning Problem

*Get tea, biscuits, and a book.*

□ Given:

- **Initial state:** The agent is at *home* without tea, biscuits, book
- **Goal state:** The agent is at *home* with tea, biscuits, book

# The Planning Problem

- ❑ States can be represented by predicates such as  $At(x)$ ,  $Have(y)$ ,  $Sells(x, y)$
  
- ❑ Actions:
  - $Go(y)$  : Agent goes to  $y$ 
    - causes  $At(y)$  to be true
  - $Buy(z)$ : Agent buys  $z$ 
    - causes  $Have(z)$  to be true
  - $Steal(z)$ : Agent steals  $z$

# Planning as Search

- ❑ Actions are given as logical descriptions of preconditions and effects.
  - This enables the planner to make direct connections between states and actions.
- ❑ The planner is free to add actions to the plan wherever they are required, rather than in an incremental way starting from the initial state.
- ❑ Most parts of the world are independent of most other parts – hence divide & conquer works well.

# Situation Calculus

## □ Initial state:

$$\text{At(Home, s0)} \wedge \neg \text{Have(Tea, s0)} \wedge \\ \neg \text{Have(Biscuits, s0)} \wedge \neg \text{Have(Book, s0)}$$

## □ Goal state:

$$\exists s \text{ At(Home, s)} \wedge \text{Have(Tea, s)} \wedge \\ \text{Have(Biscuits, s)} \wedge \text{Have(Book, s)}$$

# Situation Calculus

Operators:

$$\forall a,s \text{ Have}(\text{Tea}, \text{Result}(a,s)) \Leftrightarrow$$
$$[(a = \text{Buy}(\text{Tea}) \wedge \text{At}(\text{Tea-shop},s))$$
$$\vee (\text{Have}(\text{Tea}, s) \wedge a \neq \text{Drop}(\text{Tea}))]$$

**Result(a,s) names the situation resulting from executing the action a in the situation s**

# Practical Planners

□ To make planning practical we need to:

- Restrict the language with which we define problems. With a restrictive language, there are fewer possible solutions to search through
- Use a special-purpose algorithm called a *planner* rather than a general purpose theorem prover.



# STRIPS

- ❑ **STanford Research Institute Problem Solver**
- ❑ **Many planners today use specification languages that are variants of the one used in STRIPS.**

# Representing states

- States are represented by conjunctions of function-free ground literals

$\text{At}(\text{Home}) \wedge \neg \text{Have}(\text{Tea}) \wedge$   
 $\neg \text{Have}(\text{Biscuits}) \wedge \neg \text{Have}(\text{Book})$

# Representing goals

- Goals are also described by conjunctions of literals

$At(Home) \wedge Have(Tea) \wedge$   
 $Have(Biscuits) \wedge Have(Book)$

- Goals can also contain variables

$At(x) \wedge Sells(x, Tea)$

- The above goal is *being at a shop that sells tea*

# Representing Actions

- ❑ Action description – serves as a name
- ❑ Precondition – a conjunction of positive literals (why positive?)
- ❑ Effect – a conjunction of literals (+ve or –ve)
  - The original version had an *add list* and a *delete list*.

Op( **ACTION:** Go(there),  
    **PRECOND:** At(there)  $\wedge$  Path(there, there),  
    **EFFECT:** At(there)  $\wedge$   $\neg$ At(there))

# Representing Plans

- ❑ A set of plan steps. Each step is one of the operators for the problem.
- ❑ A set of step ordering constraints. Each ordering constraint is of the form  $S_i \prec S_j$ , indicating  $S_i$  must occur sometime before  $S_j$ .
- ❑ A set of variable binding constraints of the form  $v = x$ , where  $v$  is a variable in some step, and  $x$  is either a constant or another variable.
- ❑ A set of causal links written as  $S \rightarrow_c S'$  indicating  $S$  satisfies the precondition  $c$  for  $S'$ .

# Example

## □ Actions

Op( **ACTION:** RightShoe,  
          **PRECOND:** RightSockOn,  
          **EFFECT:** RightShoeOn)

Op( **ACTION:** RightSock,  
          **EFFECT:** RightSockOn)

Op( **ACTION:** LeftShoe,  
          **PRECOND:** LeftSockOn,  
          **EFFECT:** LeftShoeOn)

Op( **ACTION:** LeftSock,  
          **EFFECT:** LeftSockOn)

# Example

## □ Initial plan

Plan(

**STEPS:** {

S1: Op( ACTION: start ),

S2: Op( ACTION: finish,

PRECOND: RightShoeOn  $\wedge$   
LeftShoeOn ) },

**ORDERINGS:** {S<sub>1</sub> < S<sub>2</sub>},

**BINDINGS:** {},

**LINKS:** { } )

# Action Description Language (ADL)

STRIPS	ADL
Only +ve literals in states <i>Fat</i> $\wedge$ <i>Slow</i>	Both +ve and -ve literals in states $\neg$ <i>Thin</i> $\wedge$ $\neg$ <i>Fast</i>
Closed World: Unmentioned literals are false	Open World: Unmentioned literals are unknown
Effect $P \wedge \neg Q$ means add P, delete Q	Effect $P \wedge \neg Q$ means add P, $\neg Q$ and delete Q, $\neg P$



# Action Description Language (ADL)

STRIPS	ADL
Only ground literals in goals <i>Fat</i> $\wedge$ <i>Slow</i>	Quantified variables in goals $\exists x$ <i>At(Tea,x)</i> $\wedge$ <i>At(Coffee,x)</i>
Goals are conjunctions	Goals allow conjunctions and disjunctions

# Partial Order Planning

## Initial state:

Op( **ACTION:** Start,

**EFFECT:** At(Home)  $\wedge$  Sells(BS, Book)

$\wedge$  Sells(TS, Tea)

$\wedge$  Sells(TS, Biscuits) )

## Goal state:

Op( **ACTION:** Finish,

**PRECOND:** At(Home)  $\wedge$  Have(Tea)

$\wedge$  Have(Biscuits)

$\wedge$  Have(Book) )

# Partial Order Planning

## Actions:

Op( **ACTION:** Go(there),

**PRECOND:** At(here),

**EFFECT:** At(there)  $\wedge$   $\neg$ At(here))

Op( **ACTION:** Buy(x),

**PRECOND:** At(store)  $\wedge$  Sells(store, x),

**EFFECT:** Have(x))

# POP Example

## Initial state:

Op( **ACTION:** Start,  
    **EFFECT:** At(Home)  $\wedge$  Sells(BS, Book)  
                   $\wedge$  Sells(TS, Tea)  
                   $\wedge$  Sells(TS, Biscuits) )

## Goal state:

Op( **ACTION:** Finish,  
    **PRECOND:** At(Home)  $\wedge$  Have(Tea)  
                   $\wedge$  Have(Biscuits)  
                   $\wedge$  Have(Book) )

## Actions:

Op( **ACTION:** Go(y),  
    **PRECOND:** At(x),  
    **EFFECT:** At(y)  $\wedge$   $\neg$ At(x))

Op( **ACTION:** Buy(x),  
    **PRECOND:** At(y)  $\wedge$  Sells(y, x),  
    **EFFECT:** Have(x))

**START**

**At(Home)  $\wedge$  Sells(BS, Book)  $\wedge$  Sells(TS, Tea)  $\wedge$  Sells(TS, Biscuits)**



**Have(Book)  $\wedge$  Have(Tea)  $\wedge$  Have(Biscuits)  $\wedge$  At(Home)**

**FINISH**

START

$At(Home) \wedge Sells(BS, Book) \wedge Sells(TS, Tea) \wedge Sells(TS, Biscuits)$

$At(y1) \wedge Sells(y1, Book)$

Buy(Book)

$At(y2) \wedge Sells(y2, Tea)$

Buy(Tea)

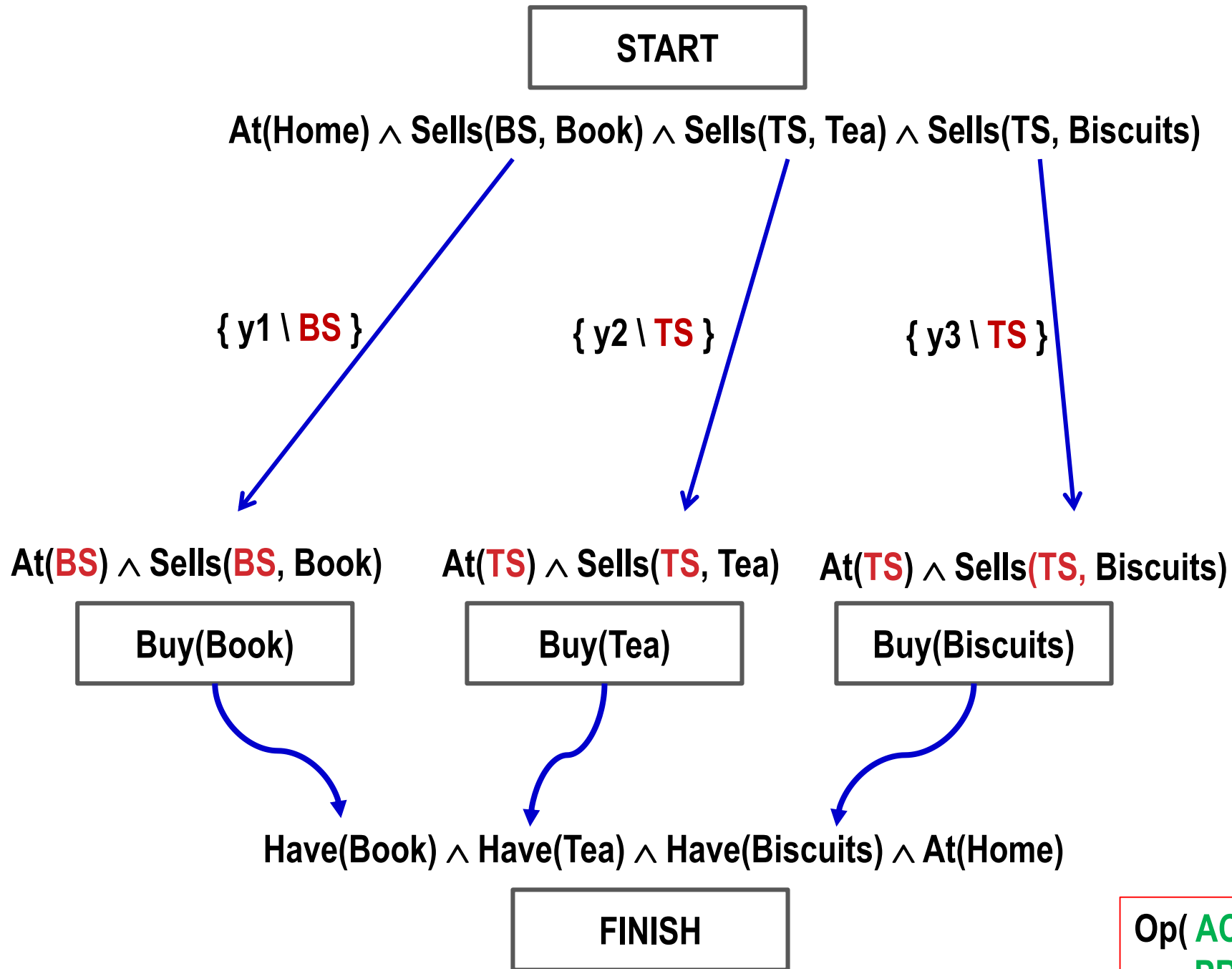
$At(y3) \wedge Sells(y3, Biscuits)$

Buy(Biscuits)

$Have(Book) \wedge Have(Tea) \wedge Have(Biscuits) \wedge At(Home)$

FINISH

Op( **ACTION:** Buy(x),  
**PRECOND:**  $At(y) \wedge Sells(y, x)$ ,  
**EFFECT:** Have(x))



Op( **ACTION:** Buy(x),  
**PRECOND:** At(y) ∧ Sells(y, x),  
**EFFECT:** Have(x))

START

$At(\text{Home}) \wedge Sells(\text{BS}, \text{Book}) \wedge Sells(\text{TS}, \text{Tea}) \wedge Sells(\text{TS}, \text{Biscuits})$

$At(y1)$

Go(BS)

$\neg At(y1)$

$At(y2)$

Go(TS)

$\neg At(y2)$

$At(\text{BS}) \wedge Sells(\text{BS}, \text{Book})$

Buy(Book)

$At(\text{TS}) \wedge Sells(\text{TS}, \text{Tea})$

Buy(Tea)

$At(\text{TS}) \wedge Sells(\text{TS}, \text{Biscuits})$

Buy(Biscuits)

$Have(\text{Book}) \wedge Have(\text{Tea}) \wedge Have(\text{Biscuits}) \wedge At(\text{Home})$

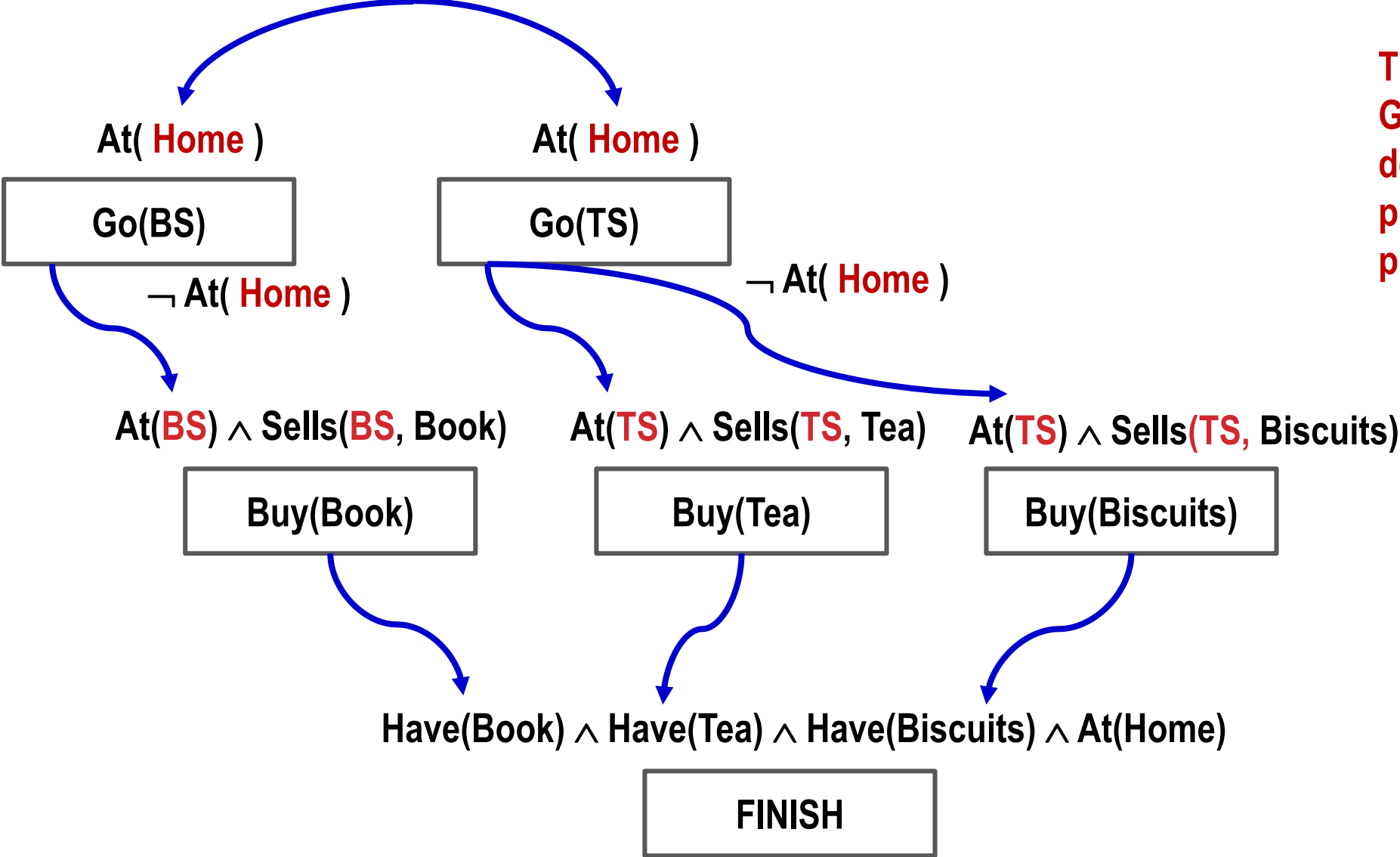
FINISH

Op( **ACTION:** Go(y),  
**PRECOND:** At(x),  
**EFFECT:** At(y)  $\wedge$   $\neg At(x)$ )



START

$At(Home) \wedge Sells(BS, Book) \wedge Sells(TS, Tea) \wedge Sells(TS, Biscuits)$



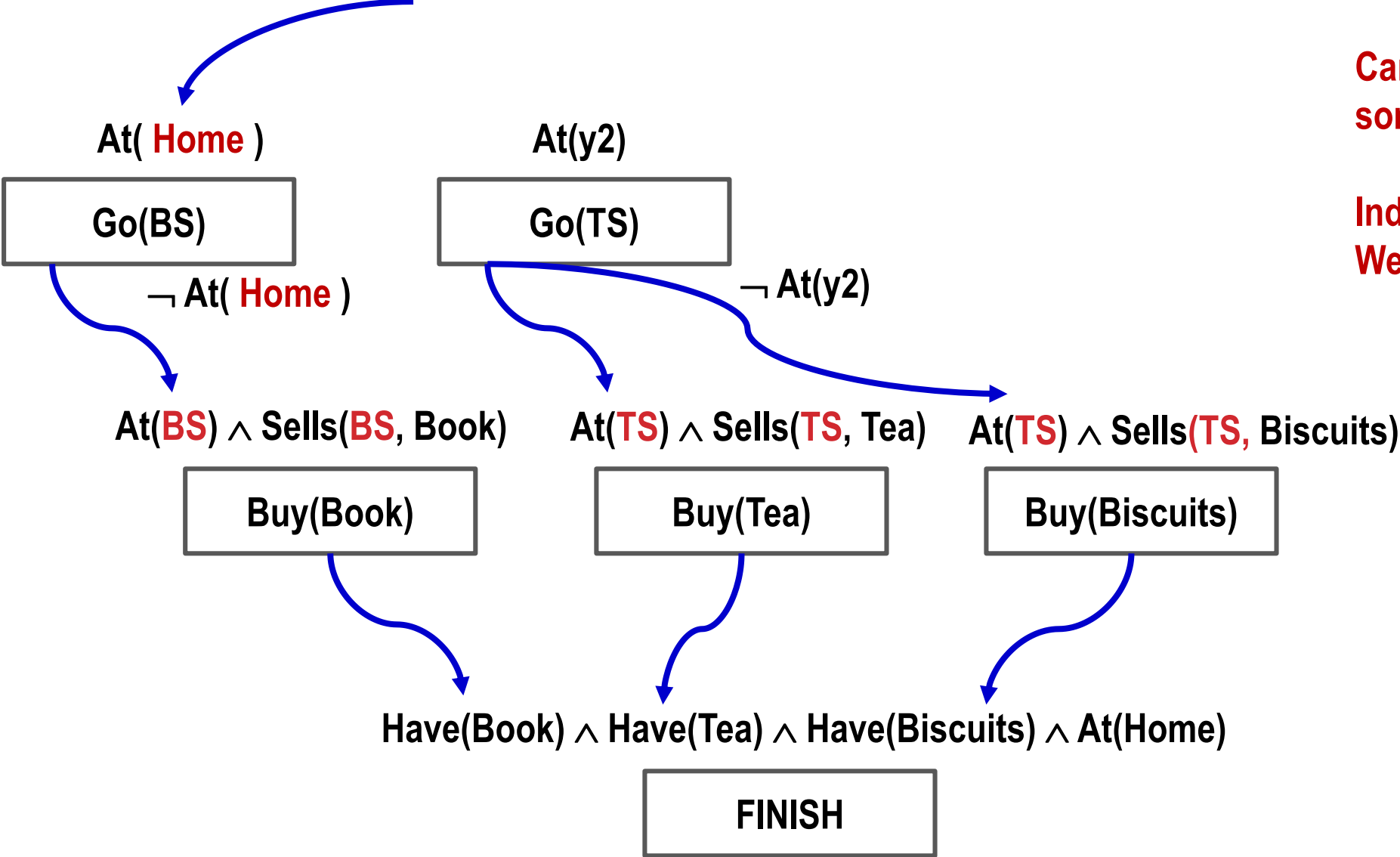
The problem here is that Go(BS) and Go(TS) destroy each other's precondition. Neither can precede the other.

START

$At(Home) \wedge Sells(BS, Book) \wedge Sells(TS, Tea) \wedge Sells(TS, Biscuits)$

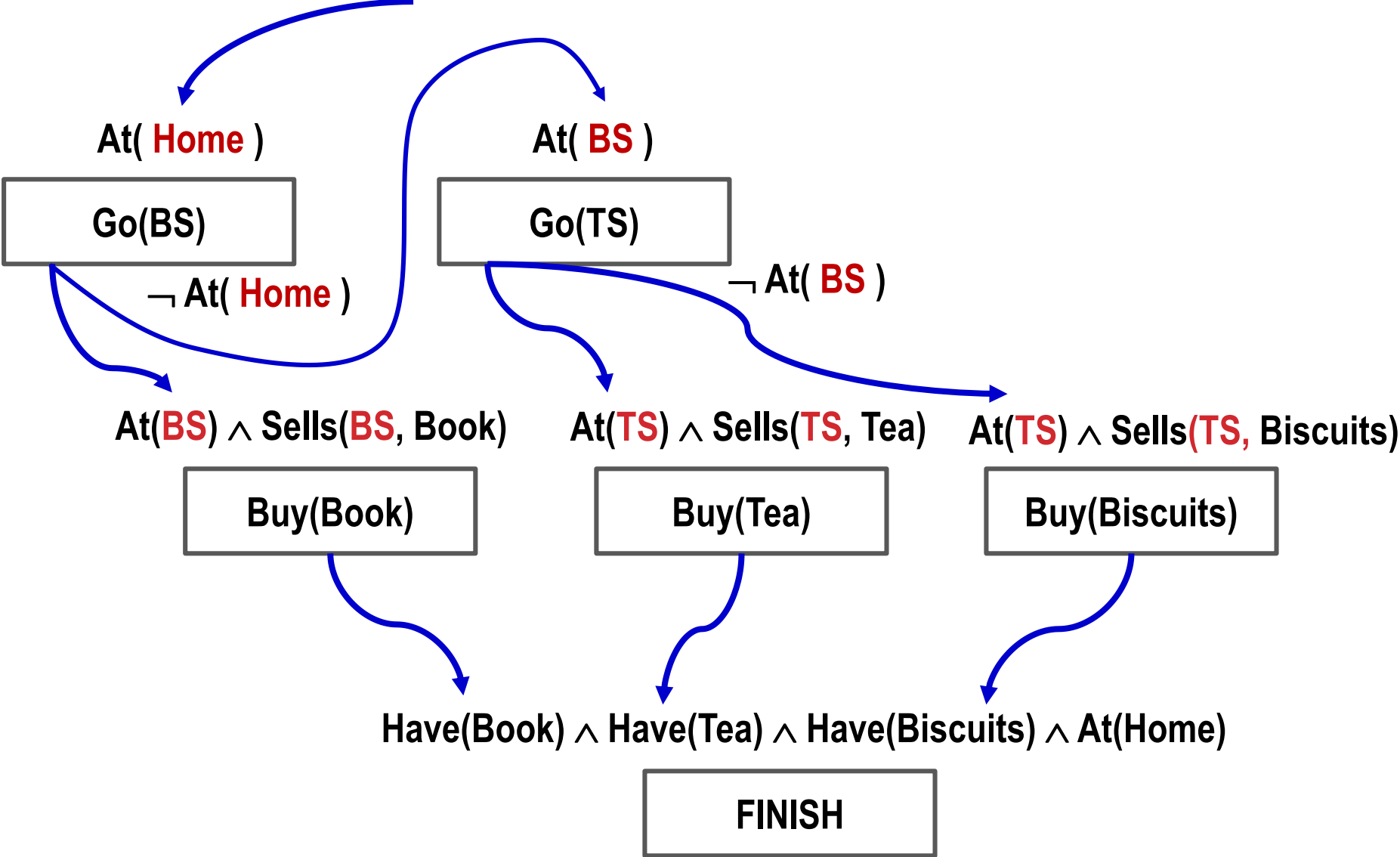
Can y2 be instantiated with something else?

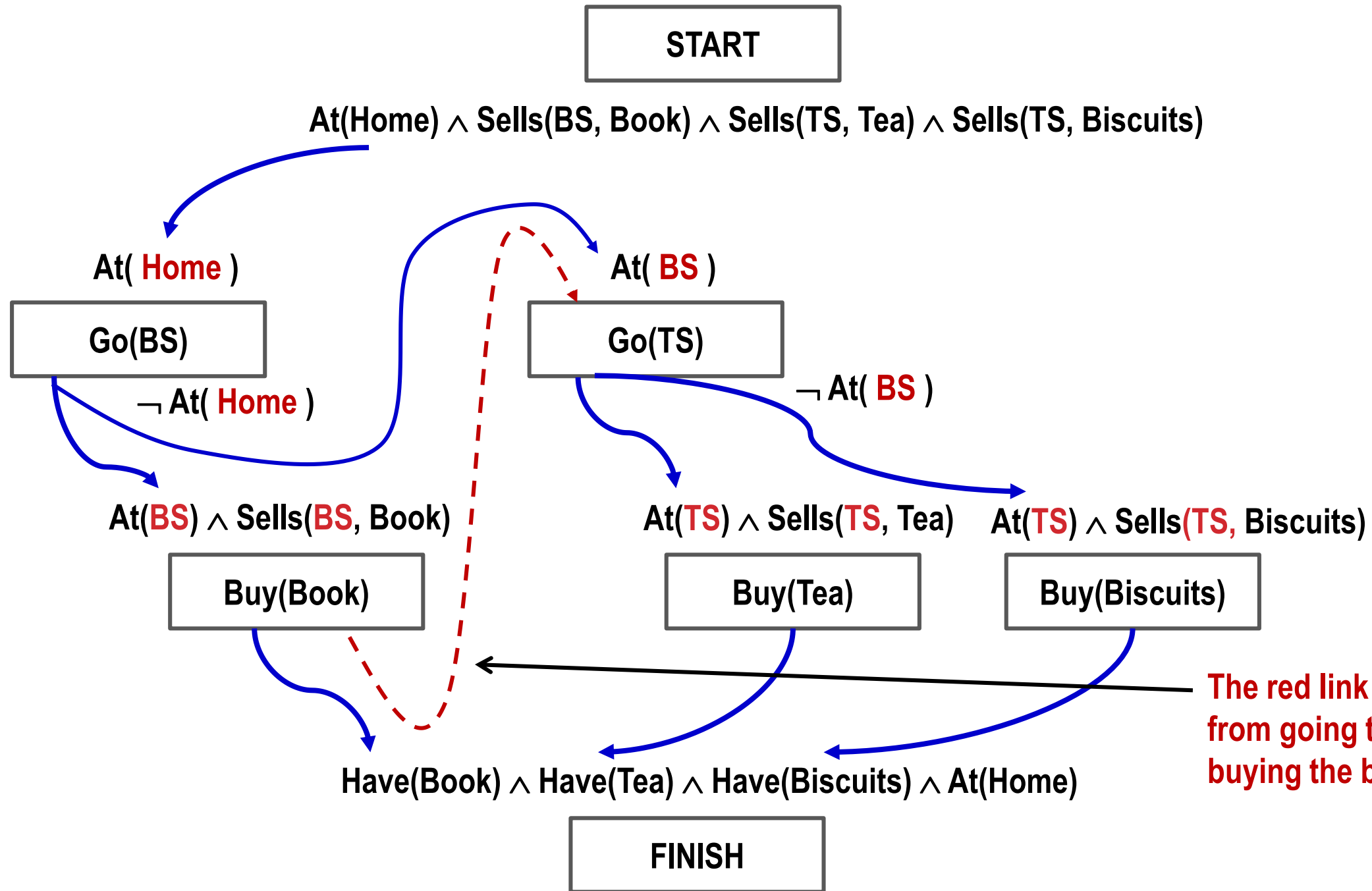
Indeed !!  
We can try BS for example.

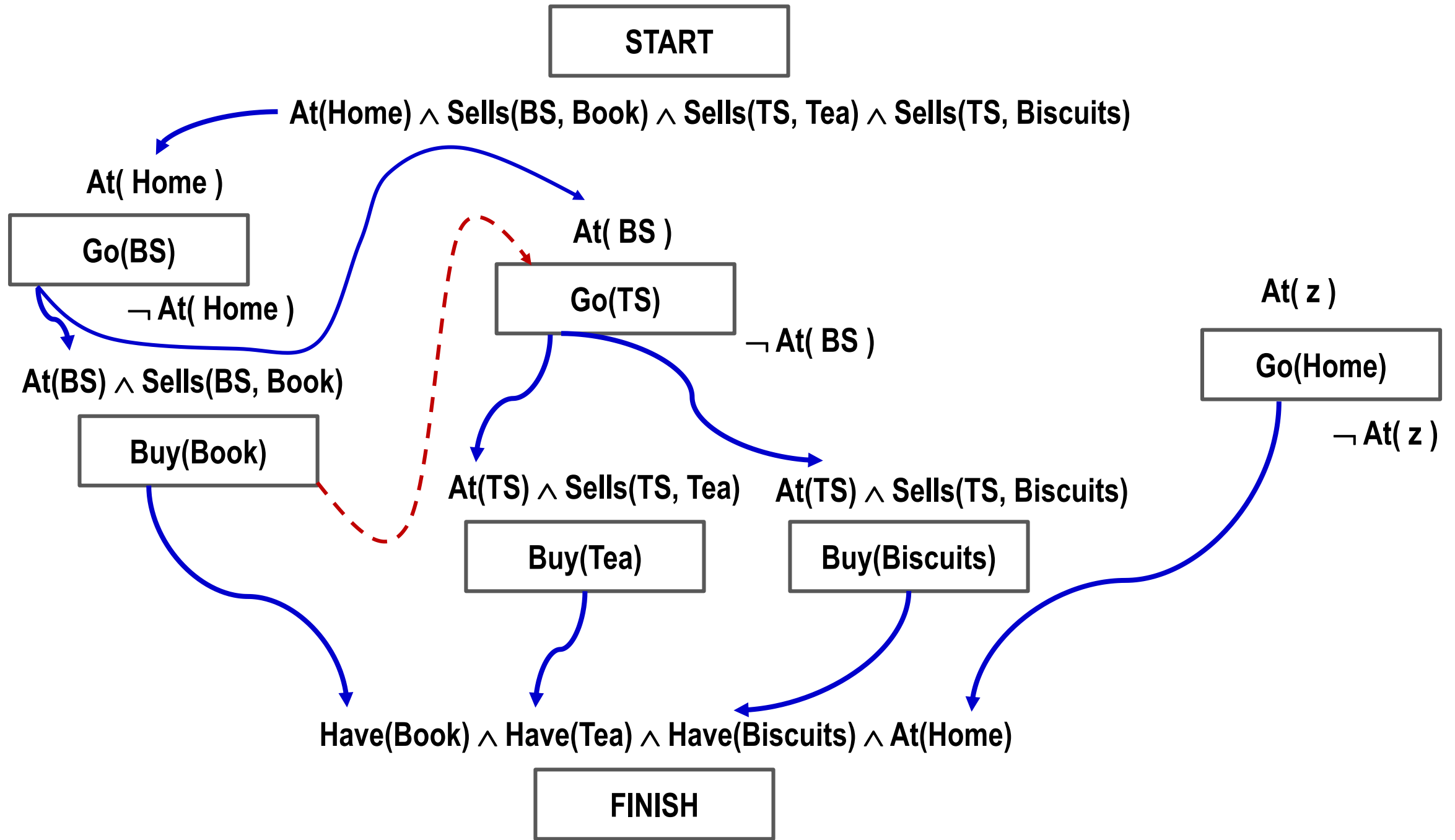


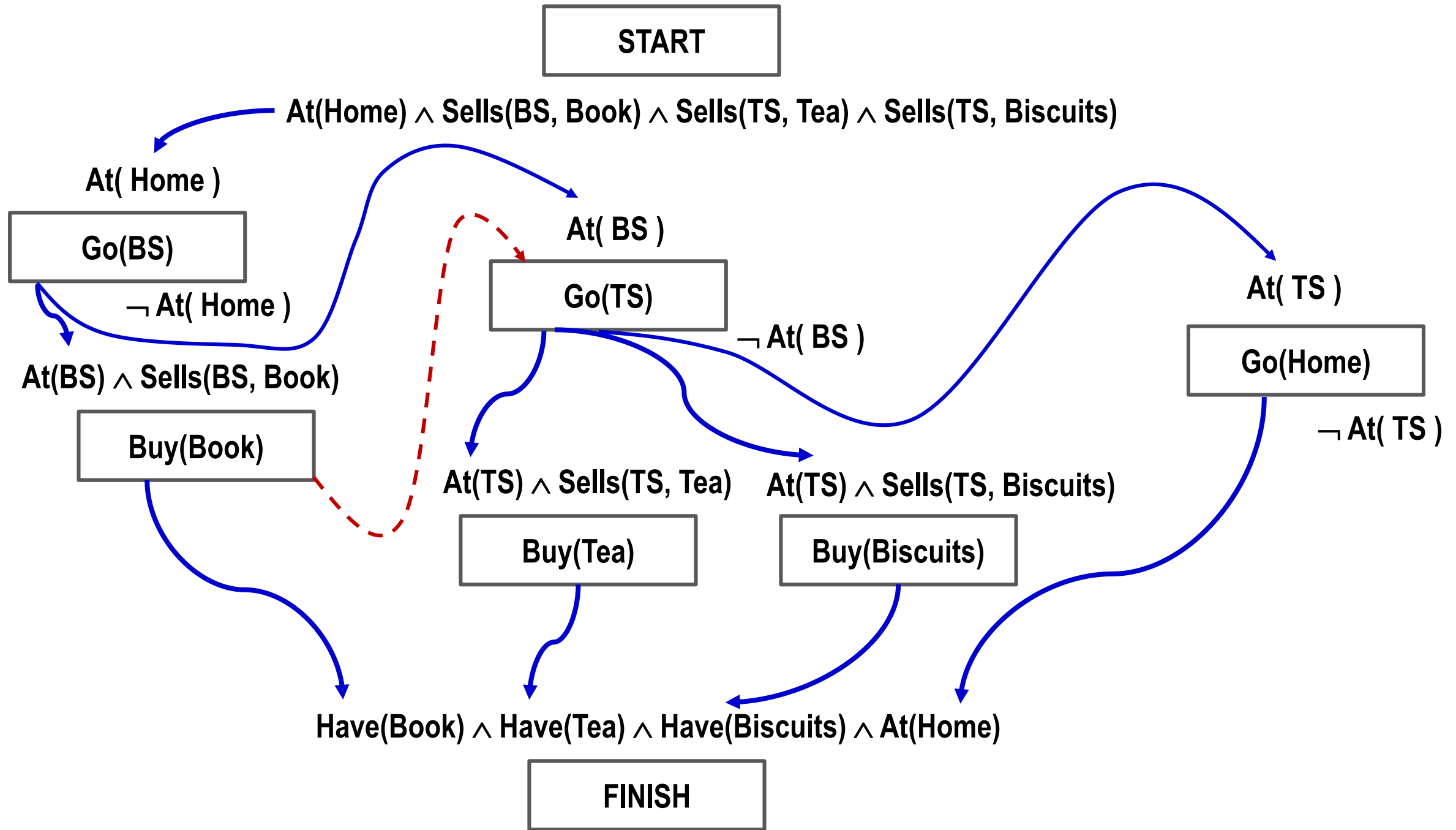
START

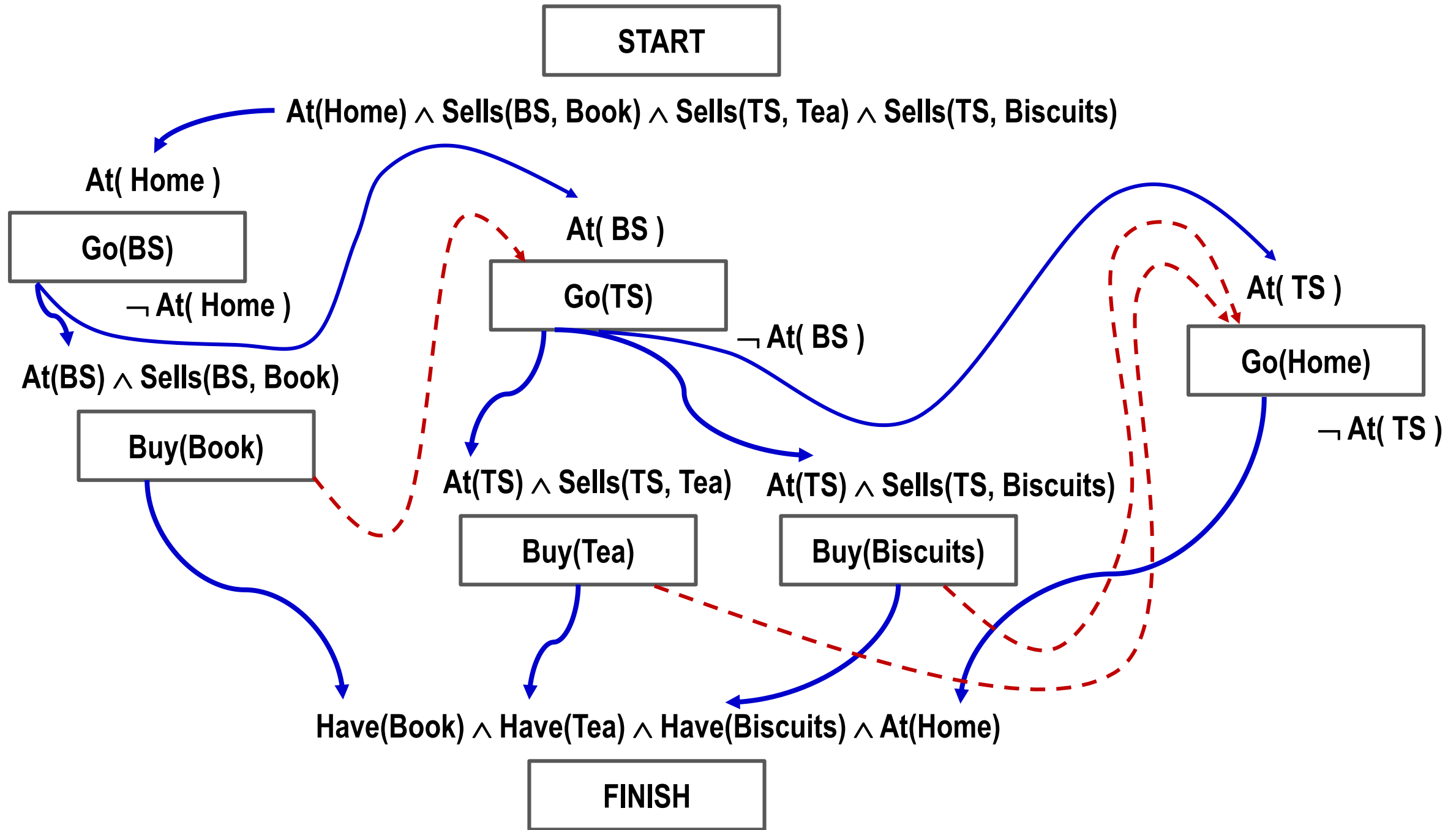
$At(Home) \wedge Sells(BS, Book) \wedge Sells(TS, Tea) \wedge Sells(TS, Biscuits)$

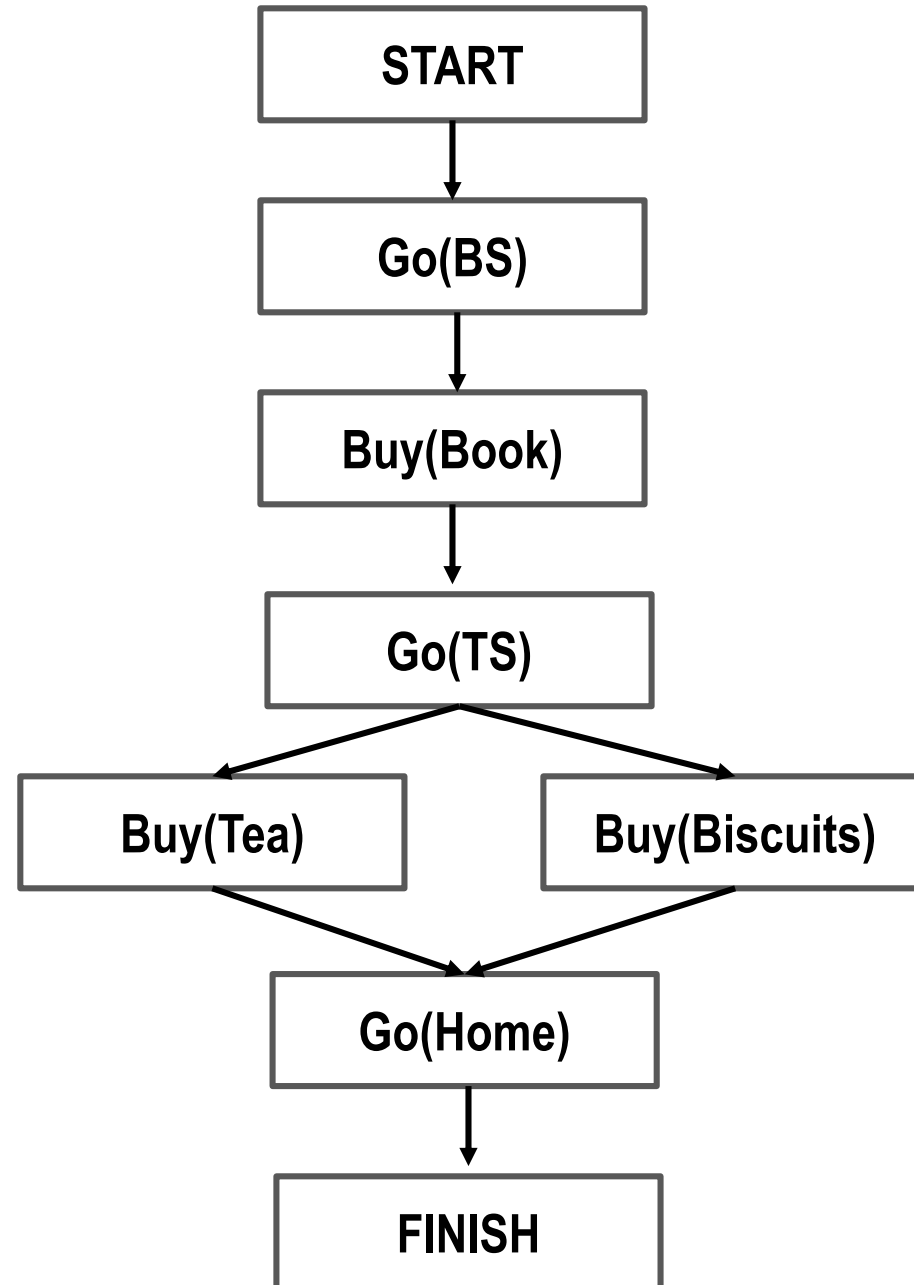














# Partial Order Planning Algorithm

Function POP( *initial*, *goal*, *operators* )

// Returns *plan*

*plan* ← Make-Minimal-Plan( *initial*, *goal* )

Loop do

    If Solution( *plan* ) then return *plan*

*S*, *c* ← Select-Subgoal( *plan* )

    Choose-Operator( *plan*, *operators*, *S*, *c* )

    Resolve-Threats( *plan* )

end

# POP Algorithm (Contd.)

Function Select-Subgoal( *plan* )

// Returns **S**, **c**

pick a plan step **S** from STEPS( *plan* )

with a precondition **c** that

has not been achieved

Return **S**, **c**

**Proc Choose-Operator**( *plan*, *operators*, *S*, *c* )

choose a step *S'* from *operators* or **STEPS**( *plan* ) that has *c* as an effect

if there is no such step then **fail**

add the causal link  $S' \rightarrow c: S$  to **LINKS**( *plan* )

add the ordering constraint  $S' \prec S$  to **ORDERINGS**( *plan* )

if *S'* is a newly added step from *operators* then add *S'* to **STEPS**( *plan* ) and add  $\text{Start} \prec S' \prec \text{Finish}$  to **ORDERINGS**( *plan* )

# POP Algorithm (Contd.)

Procedure **Resolve-Threats**( *plan* )

for each **S''** that threatens a link

**S<sub>i</sub> → c: S<sub>j</sub>** in **LINKS**( *plan* ) do

choose either

**Promotion:** Add **S'' < S<sub>i</sub>** to **ORDERINGS**( *plan* )

**Demotion:** Add **S<sub>j</sub> < S''** to **ORDERINGS**( *plan* )

if not **Consistent**( *plan* ) then **fail**

# Partially instantiated operators

- ❑ So far we have not mentioned anything about binding constraints
- ❑ Should an operator that has the effect, say,  $\neg At(x)$ , be considered a threat to the condition,  $At(Home)$  ?
  - Indeed it is a *possible threat* because  $x$  may be bound to *Home*

# Dealing with possible threats

## ❑ Resolve now with an equality constraint

- Bind  $x$  to something that resolves the threat (say  $x = TS$ )

## ❑ Resolve now with an inequality constraint

- Extend the language of variable binding to allow  $x \neq Home$

## ❑ Resolve later

- Ignore possible threats. If  $x = Home$  is added later into the plan, then we will attempt to resolve the threat (by promotion or demotion)

**Proc Choose-Operator**( *plan*, *operators*, *S*, *c* )

choose a step *S'* from *operators* or **STEPS**( *plan* ) that has *c'* as an effect

s.t.  $u = \text{UNIFY}( c, c', \text{BINDINGS}( plan ) )$

if there is no such step then **fail**

add *u* to **BINDINGS**( *plan* )

add the causal link  $S' \rightarrow c: S$  to **LINKS**( *plan* )

add the ordering constraint  $S' \prec S$  to **ORDERINGS**( *plan* )

if *S'* is a newly added step from *operators* then

add *S'* to **STEPS**( *plan* ) and add  $\text{Start} \prec S' \prec \text{Finish}$  to **ORDERINGS**( *plan* )

## Procedure Resolve-Threats( *plan* )

for each  $S_i \rightarrow c: S_j$  in LINKS( *plan* ) do

for each  $S''$  in STEPS( *plan* ) do

for each  $c'$  in EFFECTS(  $S''$  ) do

if  $\text{SUBST}(\text{BINDINGS}(\textit{plan}), c) = \text{SUBST}(\text{BINDINGS}(\textit{plan}), \neg c')$

then choose either

*Promotion:* Add  $S'' \prec S_i$  to ORDERINGS( *plan* )

*Demotion:* Add  $S_j \prec S''$  to ORDERINGS( *plan* )

if not Consistent( *plan* ) then fail