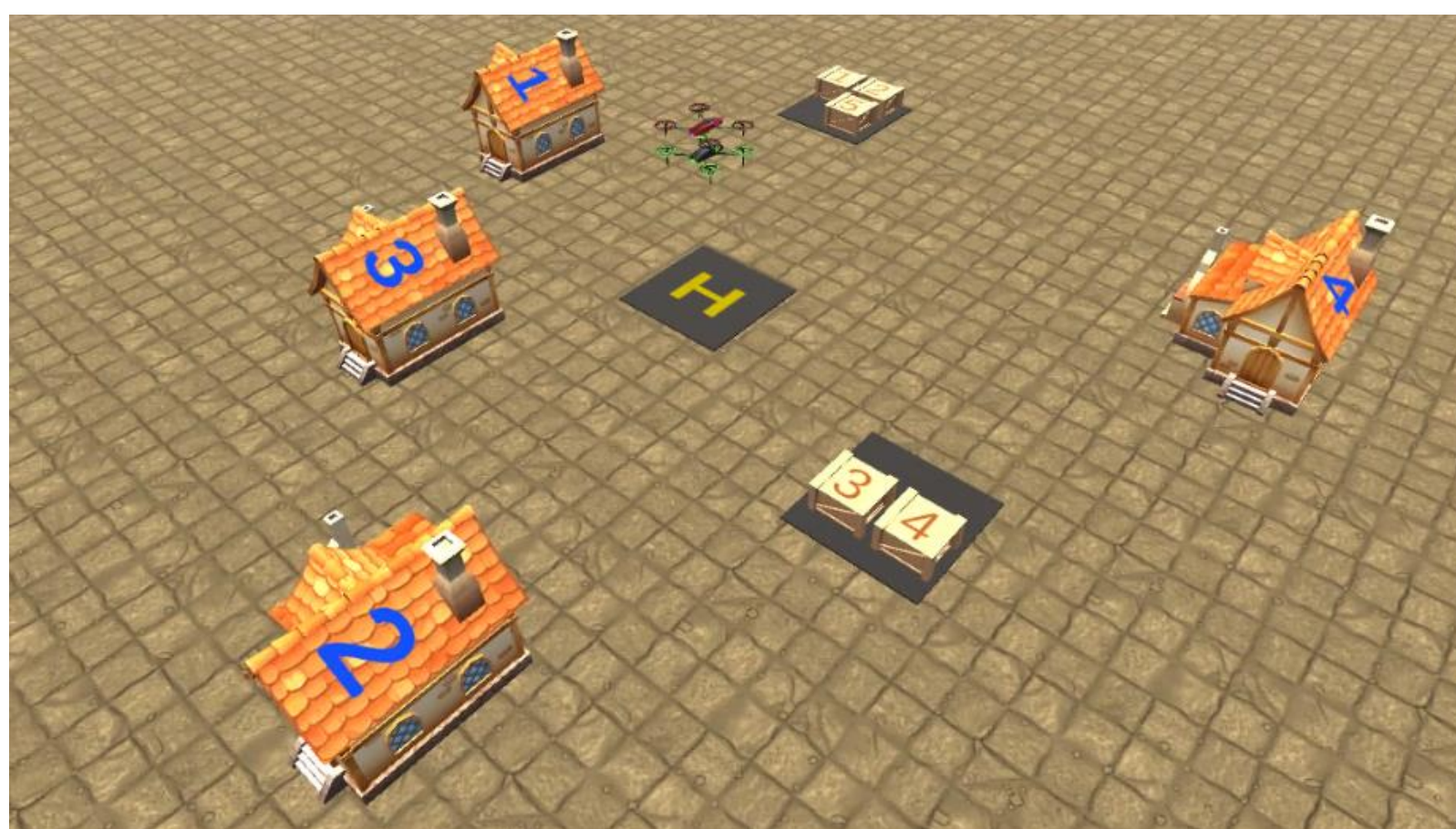


# Designing a multi-agent physical simulation

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## Introduction

- Drone-based delivery revolutionizes logistics, posing new challenges in goods transportation.
- Optimizing drone routes for efficiency and energy use adds significant complexity.
- Coordinating multiple drones amplifies this challenge, demanding advanced planning algorithms.



Our simulation Environment

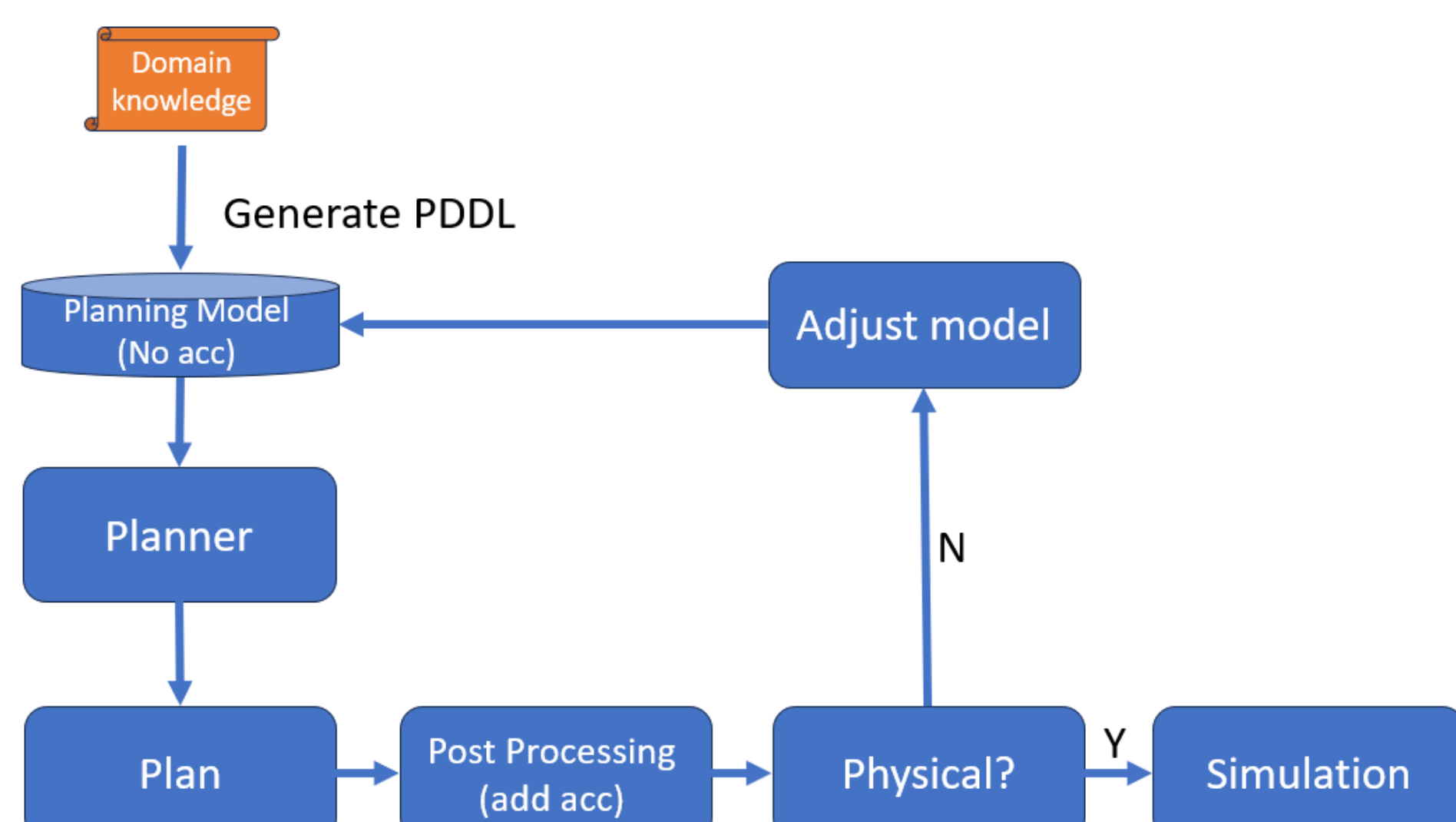
## Goal

- Design drone's pickup and delivery physical simulation, which contains time and space synchronization.

## Challenges

- Temporal – spatial planning
- Time windows for actions (e.g., House 3 accept delivers only at 14:00-16:00)
- Physical constraints
  - Max velocity, max acceleration, battery
- Minimal overall time
- Minimal battery use
- Robust to number of drones, houses, warehouses, packages, slots per drone.

## General Scheme



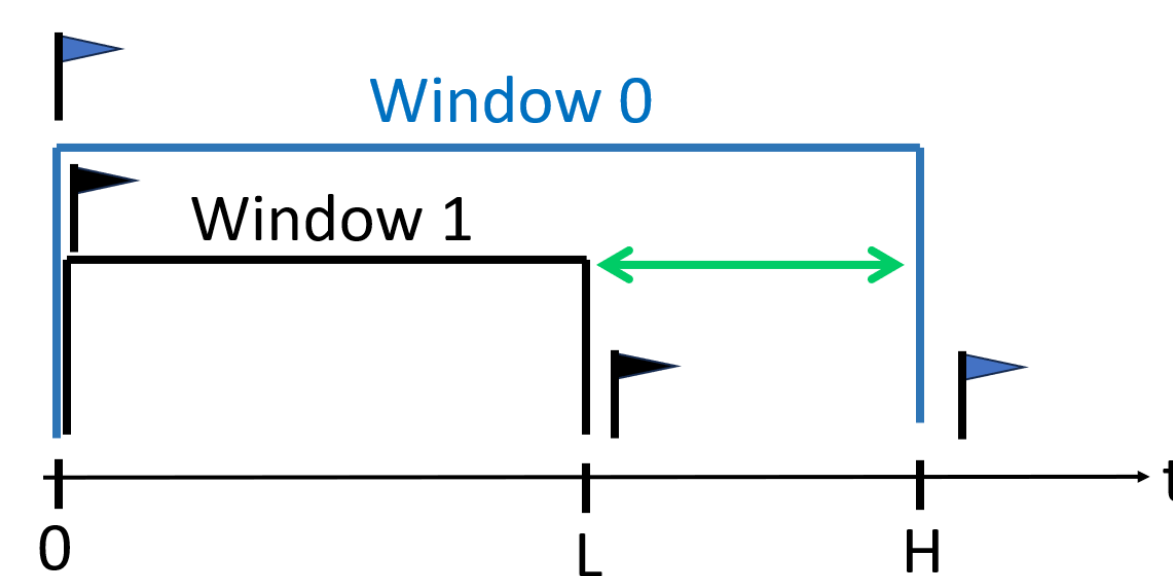
General scheme for physical simulation

- Starting with the domain knowledge, generating PDDL (Planning language) files without constraints on acceleration.
- Solving the problem using a planner, then adding acceleration into consideration.
- Checking whether the result plan is physical (e.g., obeys max velocity). If so, continue to simulation. If not, adjust model and start again.

## State and Action Space

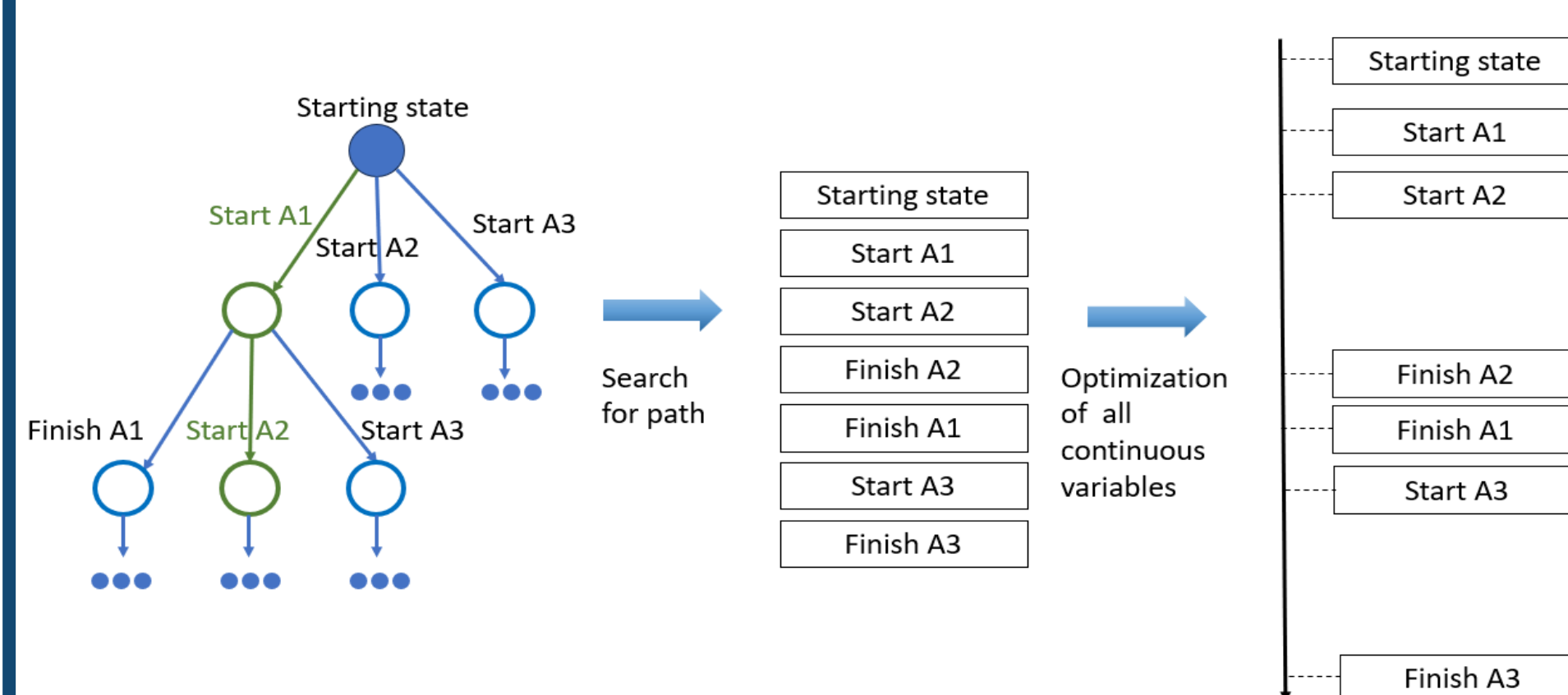
- PDDL files are generated according to arguments (e.g., no. of drones, no. of packages)
- event = start\end of action
- Inducing a large State\Action space consists of:
  - Time
  - Control variables: velocity for each drone, can change only in event
  - Position and Battery for each drone
  - Global predicates (e.g., 'has-package(d, p, s)' Indicates a package p is with drone d at slot s)
  - Actions (e.g., 'pickup(d,p,w,s)' is an action in which drone d is flying to pickup package p from warehouse w into slot s of the drone.)

## Time Windows



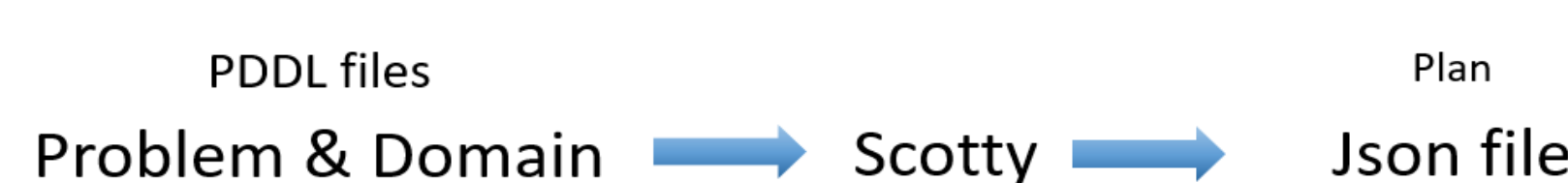
- How can we constrain an action A to a time window [L, H]?
- Solution: create 2 actions starting at t = 0 and ending at t = L and t = H respectively, each raising a flag while active.
- Add the precondition  $flag_0 = 1 \ \& \ flag_1 = 0$  to A.

## ScottyActivity planner



ScottyActivity planner scheme for solving temporal problems

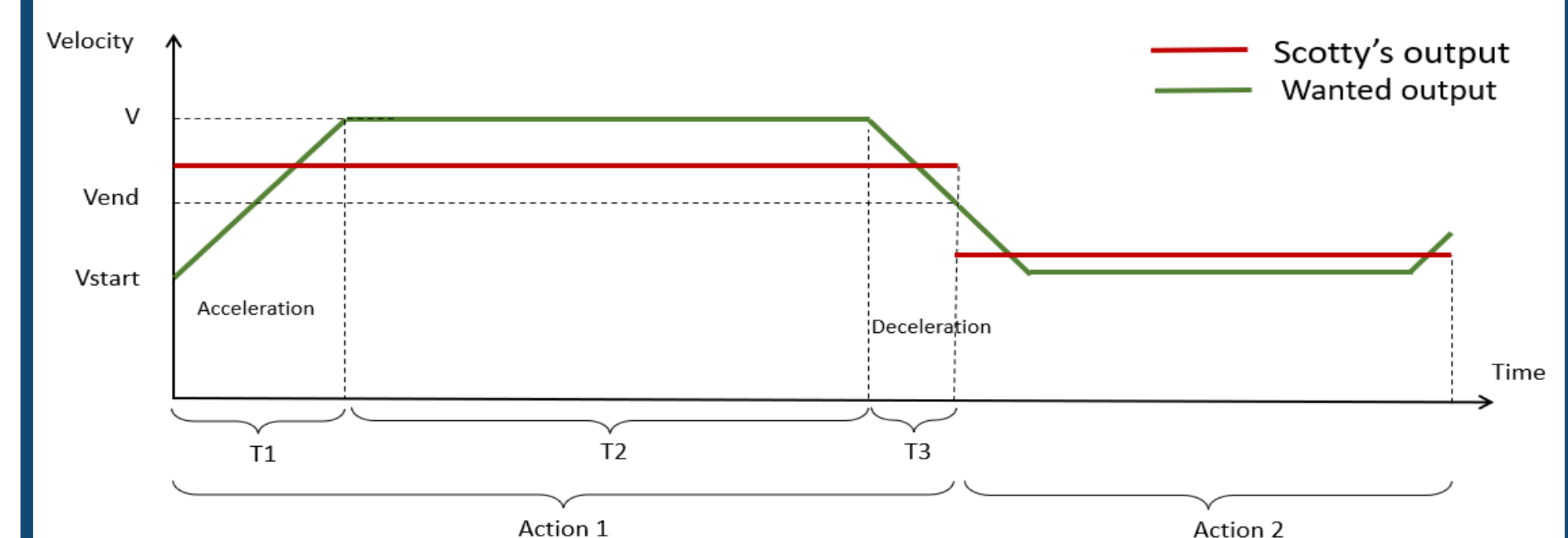
- Scotty is a planner which was developed in MIT.
- The planner searches (heuristically, with A\* or EHC) in the discrete events tree.
- Scotty solves SOCP optimization problem after every step in the search.
- The result plan contains list of events, each event has its time, updated control variables, and the current value of the continuous variables (e.g., position and battery)



Input and output - ScottyActivity

## Post processing

- Scotty's plan is not physical – between two different actions, the velocity changes instantly as shown below in red.
- We want to consider (constant) acceleration, as shown below in green.



- Define for each section  $1 \leq i \leq N$ 
  - $X_1(V) = \int_0^{T_1} V_{start} + a \cdot \text{sign}(V - V_{start}) \cdot t \ dt$
  - $X_2(V) = T_2 \cdot V$
  - $X_3(V) = \int_0^{T_3} V + a \cdot \text{sign}(V_{end} - V) \cdot t \ dt$
- Solve  $Total \ distance = (X_1 + X_2 + X_3)(V)$
- Iterate process 2 times (different initial values)
  - $\forall i (V_{start}^i, V_{end}^i) = (0,0)$  - getting  $\tilde{V}^i$
  - $\forall i (V_{start}^i, V_{end}^i) = 0.8 \cdot (\tilde{V}^i, \tilde{V}^{i+1})$  - getting  $V^i$

## Simulation in Unity

- We simulated the physical plan with Unity – an engine for developing video games.



## Results

### Our scenario:

- 2 drones, Max velocity  $15 \left[ \frac{m}{s} \right]$ , acceleration  $4.75 \left[ \frac{m}{sec^2} \right]$  (real specs).
- 4 houses, 2 warehouses, 5 packages.
- House 3 gets packages {3,5} only in a timed window. (3 variants)
- Feedback:** The 1st plan from scotty after post processing wasn't physical feasible. Drones had intervals with  $V = 16.3 \setminus 17.3$ , max is 15.
- Solution:** Change max velocity constraint in PDDL from 15 to 13 (the physical constraint).
- This way the velocity won't go above the physical constraint after post processing.
- Verdict:** plan satisfies all requirements

## Summery

- Solving spatial-temporal planning problem.
- Generating PDDL files according to problem (with time intervals).
- Study and use ScottyActivity – advanced planner.
- Physical Plan by solving physical equations.
- Feedback mechanic.
- Simulation with Unity.

