

Mars Exploration using PDDL and IndiGolog



SAPIENZA
UNIVERSITÀ DI ROMA

Ettore Branca 1965733
Francesco Caracci 1915689

Project Idea

The idea for our project is an exploration task in a partially known environment, where autonomous agents, such as rovers and drones, collaborate to scan and explore areas and to collect resources.



Environment Description

The environment consists of a base station, multiple unknown locations and various obstacles, such as rocks and pits.

- **Drones** can fly over locations, scan areas for obstacles and determine traversability before rovers proceed.
- **Rovers** can move between traversable locations, explore areas and collect resources.
- The mission involves resource collection while minimizing energy consumption.

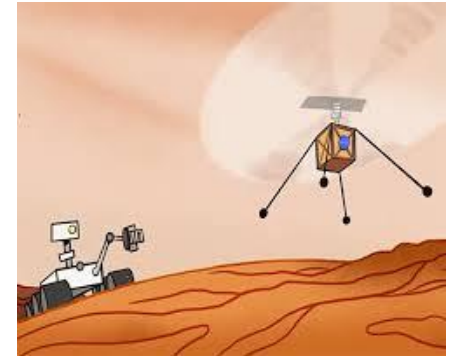


PDDL: domain description

```
(:types
  agent location obstacle resource - object
  rover drone - agent
  base unknown_area - location
)

(:predicates
  (at ?agent - agent ?loc - location)
  (adjacent ?from ?to - location) 2
  (scanned ?loc - location) 2 1
  (traversable ?loc - location) 2 1
  (obstacle_at ?obst - obstacle ?loc - location) 2
  (explored ?loc - location) 2 1
  (resource_at ?res - resource ?loc - location) 1 1
  (collected ?res) 1
  (charging_station ?loc - location) 1
)

(:functions (energy-level ?agent - agent) 3 3 1=
  (total-cost) 6
)
```



PDDL: domain description

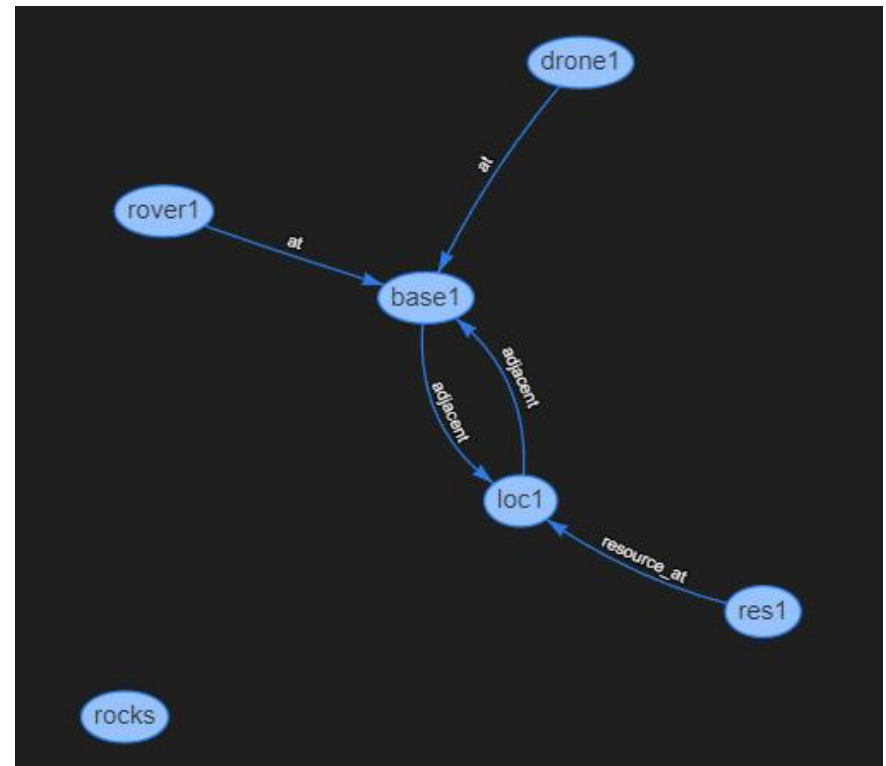
Action	Description	Prerequisites	Effects
Fly	The drone moves between two adjacent locations.	<ul style="list-style-type: none"> - The drone is in the current location; - The destination is adjacent to the current location; - The drone has sufficient energy. 	<ul style="list-style-type: none"> - The drone changes its position to the destination; - The energy decreases by 1.
Scan	The drone scans an unknown location.	The drone is at the location to be scanned.	The location is marked as scanned and, if no obstacles are present, as traversable.
Move	The rover travels between two traversable locations.	<ul style="list-style-type: none"> - The rover is in the current location; - The destination location is adjacent, scanned and traversable; - The rover has sufficient energy. 	<ul style="list-style-type: none"> - The rover moves to the destination; - The energy decreases by 1 unit.
Explore	The rover explores a location to gather information.	<ul style="list-style-type: none"> - The rover is at the current location; - The location has not been explored yet; - The rover has sufficient energy. 	<ul style="list-style-type: none"> - The location is marked as explored; - The energy decreases by 2.
Collect	The rover collects resources from an explored location.	<ul style="list-style-type: none"> - The rover is at the current location; - The location is explored; - The resource is present at the location. 	The resource is collected and no longer available.
Recharge	The agent recharges its energy at the charging station.	The agent is in a location with a charging station.	The energy level is restored to 10 units.

PDDL: problem 1 description

```
(:init
;; Initial positions
(at rover1 base1)
(at drone1 base1)
;; Assume base is known and safe
(scanned base1)
(traversable base1)
(explored base1)
;; Adjacency relationships (assume bidirectional travel)
(adjacent base1 loc1)
(adjacent loc1 base1)
;; Charging station available at the base
(charging_station base1)
;; Energy levels
(= (energy-level rover1) 0)
(= (energy-level drone1) 0)
;; Resource location
(resource_at res1 loc1)
;; Total cost counter initialization
(= (total-cost) 0)
)

(:goal (and
  (collected res1)
  (at rover1 base1)
  (at drone1 base1)
))

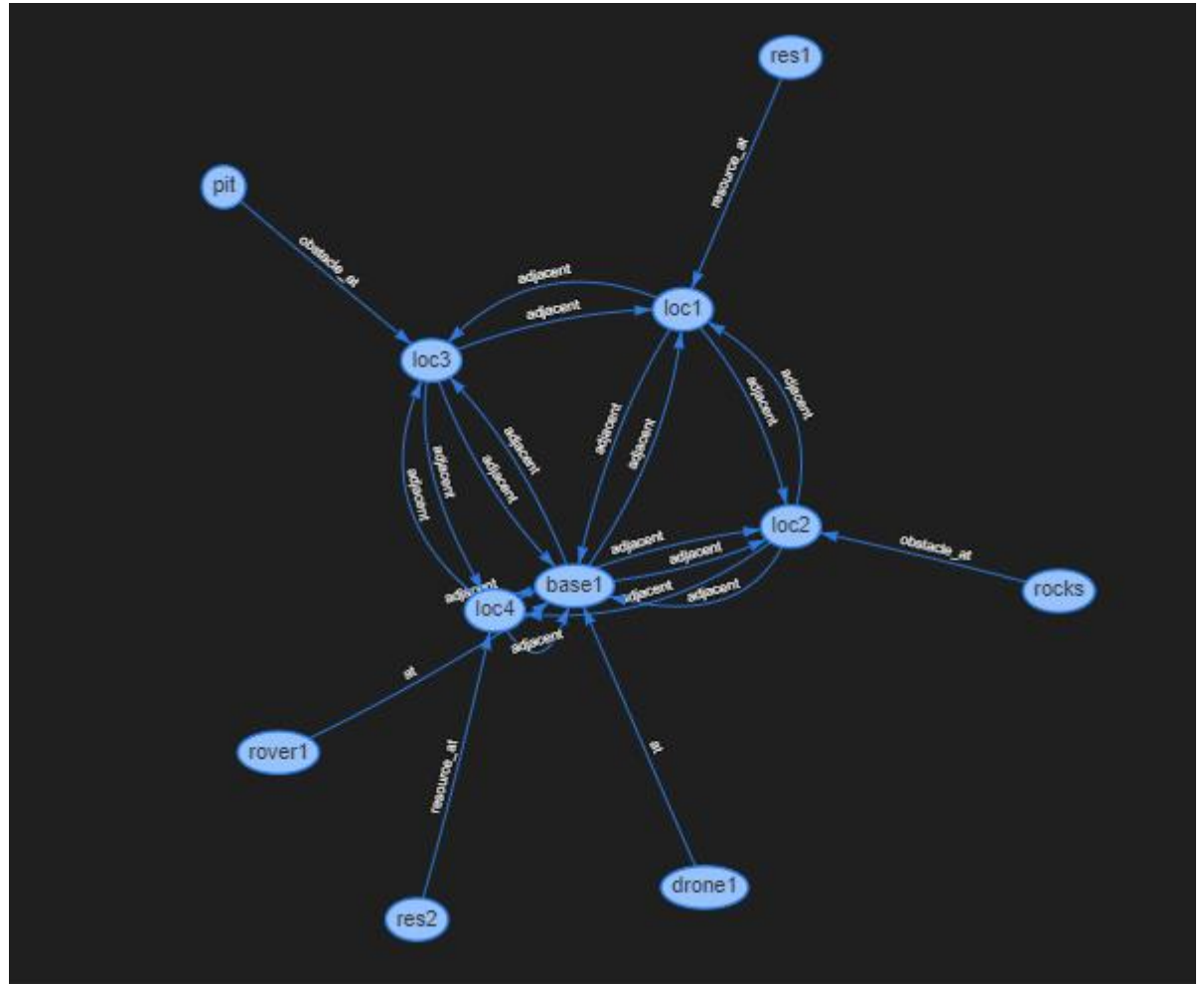
(:metric minimize (total-cost))
)
```



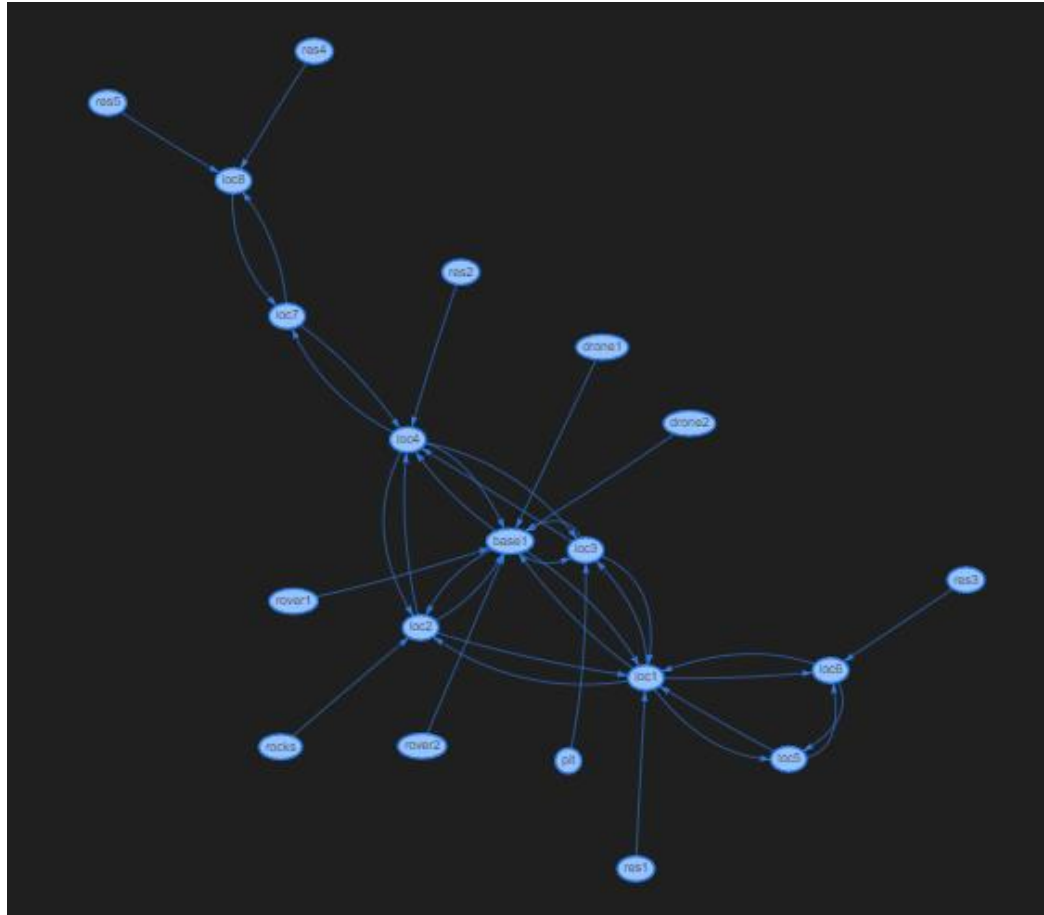
PDDL: problem 2 description

```
(:objects
  rover1 - rover
  drone1 - drone
  base1 - base
  loc1 loc2 loc3 loc4 - unknown_area
  res1 res2 - resource
  rocks pit - obstacle
```

```
(:goal (and
  (collected res1)
  (collected res2)
  (at rover1 base1)
  (at drone1 base1)
))
(:metric minimize (total-cost))
```



PDDL: problem 3 description



```
(:objects
  rover1 rover2 - rover
  drone1 drone2 - drone
  base1 - base
  loc1 loc2 loc3 loc4 loc5 loc6 loc7 loc8 - unknown_area
  res1 res2 res3 res4 res5 - resource
  rocks pit - obstacle
```

```
(:goal (and
  (collected res5)
  (collected res4)
  (collected res3)
  (collected res2)
  (collected res1)
  (at rover1 base1)
  (at drone1 base1)
  (at rover2 base1)
  (at drone2 base1))

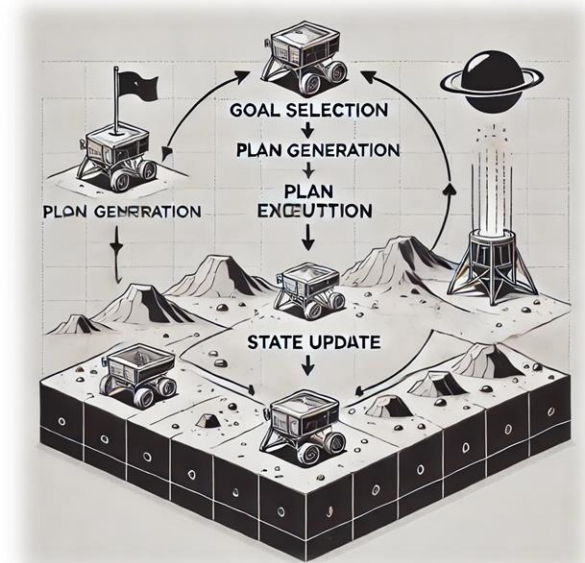
(:metric minimize (total-cost))
```


Solver and Heuristics

The planning component has been handled using **ENHSP** (Expressive Numeric Heuristic Search Planner), a PDDL-based planner that supports Classical and Numeric Planning (PDDL2.1).

To optimize planning, we have evaluated the following heuristics:

- **Sat-hadd**: *Greedy Best First Search* with numeric *hadd*.
- **Opt-hmax**: A^* with numeric *hmax*.



PDDL: problem 1 solution

```
Running Greedy Best First Search
h(n = s_0)=48.0
g(n)= 5.0 h(n)=28.0
g(n)= 10.0 h(n)=13.0
g(n)= 11.0 h(n)=10.0
g(n)= 12.0 h(n)=6.0
g(n)= 13.0 h(n)=5.0
g(n)= 14.0 h(n)=4.0
g(n)= 16.0 h(n)=2.0
g(n)= 17.0 h(n)=1.0
g(n)= 18.0 h(n)=0.0
Problem Solved
```

Found Plan:

```
0.0: (recharge drone1 base1)
1.0: (recharge rover1 base1)
2.0: (fly drone1 base1 loc1)
3.0: (scan drone1 loc1)
4.0: (fly drone1 loc1 base1)
5.0: (move rover1 base1 loc1)
6.0: (explore rover1 loc1)
7.0: (collect rover1 res1 loc1)
8.0: (move rover1 loc1 base1)
```

Plan-Length:9

Metric (Search):18.0

Planning Time (msec): 382

Heuristic Time (msec): 2

Search Time (msec): 18

Expanded Nodes:10

States Evaluated:23

```
Running WA-STAR
h(n = s_0)=6.0
f(n) = 6.0 (Expanded Nodes: 0, B
f(n) = 11.0 (Expanded Nodes: 1,
f(n) = 12.0 (Expanded Nodes: 5,
f(n) = 13.0 (Expanded Nodes: 6,
f(n) = 14.0 (Expanded Nodes: 9,
f(n) = 15.0 (Expanded Nodes: 10,
f(n) = 16.0 (Expanded Nodes: 13,
f(n) = 17.0 (Expanded Nodes: 19,
f(n) = 18.0 (Expanded Nodes: 27,
Problem Solved
```

Found Plan:

```
0.0: (recharge drone1 base1)
1.0: (fly drone1 base1 loc1)
2.0: (scan drone1 loc1)
3.0: (recharge rover1 base1)
4.0: (move rover1 base1 loc1)
5.0: (explore rover1 loc1)
6.0: (collect rover1 res1 loc1)
7.0: (move rover1 loc1 base1)
8.0: (fly drone1 loc1 base1)
```

Plan-Length:9

Metric (Search):18.0

Planning Time (msec): 298

Heuristic Time (msec): 15

Search Time (msec): 31

Expanded Nodes:29

States Evaluated:53

PDDL: problem 2 solution

```
Running Greedy Best First Search
h(n = s_0)=96.0
g(n)= 5.0 h(n)=56.0
g(n)= 10.0 h(n)=26.0
g(n)= 12.0 h(n)=23.0
g(n)= 13.0 h(n)=18.0
g(n)= 14.0 h(n)=15.0
g(n)= 15.0 h(n)=11.0
g(n)= 16.0 h(n)=10.0
g(n)= 19.0 h(n)=9.0
g(n)= 20.0 h(n)=7.0
g(n)= 23.0 h(n)=5.0
g(n)= 24.0 h(n)=4.0
g(n)= 25.0 h(n)=2.0
g(n)= 27.0 h(n)=1.0
g(n)= 28.0 h(n)=0.0
Problem Solved
```

Found Plan:

```
0.0: (recharge drone1 base1)
1.0: (recharge rover1 base1)
2.0: (fly drone1 base1 loc1)
3.0: (scan drone1 loc1)
4.0: (fly drone1 loc1 base1)
5.0: (fly drone1 base1 loc4)
6.0: (scan drone1 loc4)
7.0: (fly drone1 loc4 base1)
8.0: (move rover1 base1 loc1)
9.0: (explore rover1 loc1)
10.0: (move rover1 loc1 base1)
11.0: (move rover1 base1 loc4)
12.0: (explore rover1 loc4)
13.0: (collect rover1 res2 loc4)
14.0: (move rover1 loc4 base1)
15.0: (move rover1 base1 loc1)
16.0: (collect rover1 res1 loc1)
17.0: (move rover1 loc1 base1)
```

Plan-Length:18

Metric (Search):28.0

Planning Time (msec): 340

Heuristic Time (msec): 10

Search Time (msec): 33

Expanded Nodes:30

States Evaluated:150

```
Running WA-STAR
h(n = s_0)=6.0
f(n) = 6.0 (Expanded Nodes: 0, Ev
f(n) = 11.0 (Expanded Nodes: 1, E
f(n) = 12.0 (Expanded Nodes: 3, E
f(n) = 13.0 (Expanded Nodes: 5, E
f(n) = 14.0 (Expanded Nodes: 12,
f(n) = 15.0 (Expanded Nodes: 33,
f(n) = 16.0 (Expanded Nodes: 75,
f(n) = 17.0 (Expanded Nodes: 138,
f(n) = 18.0 (Expanded Nodes: 213,
f(n) = 19.0 (Expanded Nodes: 298,
f(n) = 20.0 (Expanded Nodes: 407,
f(n) = 21.0 (Expanded Nodes: 553,
f(n) = 22.0 (Expanded Nodes: 761,
f(n) = 23.0 (Expanded Nodes: 1011
f(n) = 24.0 (Expanded Nodes: 1336
f(n) = 25.0 (Expanded Nodes: 1813
f(n) = 26.0 (Expanded Nodes: 2534
Problem Solved
```

Found Plan:

```
0.0: (recharge drone1 base1)
1.0: (fly drone1 base1 loc1)
2.0: (scan drone1 loc1)
3.0: (fly drone1 loc1 loc2)
4.0: (fly drone1 loc2 loc4)
5.0: (recharge rover1 base1)
6.0: (move rover1 base1 loc1)
7.0: (explore rover1 loc1)
8.0: (collect rover1 res1 loc1)
9.0: (scan drone1 loc4)
10.0: (move rover1 loc1 base1)
11.0: (move rover1 base1 loc4)
12.0: (explore rover1 loc4)
13.0: (collect rover1 res2 loc4)
14.0: (move rover1 loc4 base1)
15.0: (fly drone1 loc4 base1)
```

Plan-Length:16

Metric (Search):26.0

Planning Time (msec): 460

Heuristic Time (msec): 89

Search Time (msec): 154

Expanded Nodes:2538

States Evaluated:4863

PDDL: problem 3 solution

```
Running Greedy Best First Search
h(n = s_0)=608.0
```

```
g(n)= 56.0 h(n)=2.0
g(n)= 57.0 h(n)=1.0
g(n)= 58.0 h(n)=0.0
Problem Solved

Found Plan:
0.0: (recharge drone2 base1)
1.0: (recharge rover2 base1)
2.0: (fly drone2 base1 loc4)
3.0: (scan drone2 loc4)
4.0: (recharge drone1 base1)
5.0: (fly drone2 loc4 loc7)
6.0: (fly drone1 base1 loc1)
7.0: (scan drone1 loc1)
8.0: (scan drone2 loc7)
9.0: (fly drone2 loc7 loc8)
10.0: (scan drone2 loc8)
11.0: (fly drone1 loc1 loc6)
12.0: (scan drone1 loc6)
13.0: (move rover2 base1 loc4)
14.0: (recharge rover1 base1)
15.0: (move rover1 base1 loc1)
16.0: (explore rover2 loc4)
17.0: (move rover2 loc4 loc7)
18.0: (move rover2 loc7 loc8)
19.0: (explore rover2 loc8)
20.0: (explore rover1 loc1)
21.0: (fly drone1 loc6 loc1)
22.0: (fly drone1 loc1 base1)
23.0: (fly drone2 loc8 loc7)
24.0: (fly drone2 loc7 loc4)
25.0: (fly drone2 loc4 base1)
26.0: (collect rover1 res1 loc1)
27.0: (move rover1 loc1 loc6)
28.0: (explore rover1 loc6)
29.0: (collect rover1 res3 loc6)
30.0: (move rover1 loc6 loc1)
31.0: (move rover1 loc1 base1)
32.0: (collect rover2 res5 loc8)
33.0: (collect rover2 res4 loc8)
34.0: (move rover2 loc8 loc7)
35.0: (move rover2 loc7 loc4)
36.0: (collect rover2 res2 loc4)
37.0: (move rover2 loc4 base1)

Plan-Length:38
Metric (Search):58.0
Planning Time (msec): 470
Heuristic Time (msec): 50
Search Time (msec): 87
Expanded Nodes:39
States Evaluated:416
```

```
Running WA-STAR
h(n = s_0)=8.0
```

```
Running WA-STAR
h(n = s_0)=8.0
f(n) = 8.0 (Expanded Nodes: 0, Evaluated States: 0, Time: 0.015) Frontier Size: 0
f(n) = 13.0 (Expanded Nodes: 1, Evaluated States: 4, Time: 0.031) Frontier Size: 3
f(n) = 14.0 (Expanded Nodes: 7, Evaluated States: 34, Time: 0.031) Frontier Size: 27
f(n) = 15.0 (Expanded Nodes: 17, Evaluated States: 96, Time: 0.057) Frontier Size: 79
f(n) = 16.0 (Expanded Nodes: 47, Evaluated States: 272, Time: 0.083) Frontier Size: 225
f(n) = 17.0 (Expanded Nodes: 121, Evaluated States: 662, Time: 0.11) Frontier Size: 541
f(n) = 18.0 (Expanded Nodes: 257, Evaluated States: 1342, Time: 0.141) Frontier Size: 16
f(n) = 19.0 (Expanded Nodes: 525, Evaluated States: 2605, Time: 0.205) Frontier Size: 26
f(n) = 20.0 (Expanded Nodes: 983, Evaluated States: 4731, Time: 0.283) Frontier Size: 37
f(n) = 21.0 (Expanded Nodes: 1768, Evaluated States: 8248, Time: 0.409) Frontier Size: 6
f(n) = 22.0 (Expanded Nodes: 3148, Evaluated States: 14225, Time: 0.629) Frontier Size:
f(n) = 23.0 (Expanded Nodes: 5557, Evaluated States: 24540, Time: 0.991) Frontier Size:
f(n) = 24.0 (Expanded Nodes: 9814, Evaluated States: 42302, Time: 1.604) Frontier Size:
f(n) = 25.0 (Expanded Nodes: 17072, Evaluated States: 72010, Time: 2.609) Frontier Size:
f(n) = 26.0 (Expanded Nodes: 29143, Evaluated States: 120349, Time: 4.237) Frontier Size:
f(n) = 27.0 (Expanded Nodes: 49007, Evaluated States: 195928, Time: 6.77) Frontier Size:
-----Time: 10s ; Expanded Nodes: 72851 (Avg-Speed 7285.0 n/s); Evaluated States:
f(n) = 28.0 (Expanded Nodes: 81542, Evaluated States: 313547, Time: 10.788) Frontier Size:
f(n) = 29.0 (Expanded Nodes: 134821, Evaluated States: 500247, Time: 17.387) Frontier Size:
-----Time: 20s ; Expanded Nodes: 148664 (Avg-Speed 7433.0 n/s); Evaluated States:
```

```
-Time: 489s ; Expanded Nodes: 1605955 (Avg-Speed 3284.0 n/s)
thread "main" java.lang.OutOfMemoryError: Java heap space:
```

IndiGolog

Considering that our environment is dynamic and partially observable, traditional offline planning approaches, like PDDL, are not always sufficient. This is why IndiGolog becomes essential. It is a high-level programming language that provides an imperative approach, allowing for real-time execution, **exogenous events** and dynamic changes handling and **agent-sensor interaction**. In this domain, the mission can be more autonomous and resilient to unexpected challenges.



IndiGolog: Fluents

```
rel_fluent(at(_, _)).  
rel_fluent(scanned(_)).  
rel_fluent(traversable(_)).  
rel_fluent(explored(_)).  
rel_fluent(resource_at(_, _)).  
rel_fluent(collected(_)).  
rel_fluent(adjacent(_, _)).  
  
rel_fluent(sandstorm_at(_)).  
  
fun_fluent(energy_level(_)).  
  
proc(enough_energy(Agent), energy_level(Agent) > 0).
```



IndiGolog: Primitive Actions

```
%Fly action
prim_action(fly(Drone, From, To)):-
    drone(Drone), location(From), area(To).
poss(fly(Drone, From, To),
    and(at(Drone, From), and(adjacent(From, To), enough_energy(Drone)))).

% Scan action
prim_action(scan(Drone, Area)):-
    drone(Drone), area(Area).
poss(scan(Drone, Area), and(at(Drone, Area), enough_energy(Drone))).

% Move action
prim_action(move(Rover, From, To)):-
    rover(Rover), location(From), location(To).
poss(move(Rover, From, To),
    and(at(Rover, From), and(adjacent(From, To), and(traversable(To), enough_energy(Rover))))).

% Explore action
prim_action(explore(Rover, Area)):-
    rover(Rover), area(Area).
poss(explore(Rover, Area), and(at(Rover, Area), and(traversable(Area), enough_energy(Rover)))).

% Collect action
prim_action(collect(Rover, Resource, Location)):-
    rover(Rover), resource(Resource), area(Location).
poss(collect(Rover, Resource, Location),
    and(at(Rover, Location), and(resource_at(Resource, Location),
    and(neg(collected(Resource)), and(explored(Location), enough_energy(Rover)))))).

% Handle Sandstorm action
prim_action(handle_sandstorm(Area)) :- area(Area).
poss(handle_sandstorm(Area), sandstorm_at(Area)).
```


IndiGolog: Successor State Axioms

```
causes_false(fly(Drone, From, To), at(Drone, From), true).
causes_true(fly(Drone, From, To), at(Drone, To), true).
causes_val(fly(Drone, From, To), energy_level(Drone), E, E is energy_level(Drone)-1).

causes_true(scan(_Drone, Area), scanned(Area), true).
causes_val(scan(Drone, Area), energy_level(Drone), E, E is energy_level(Drone)-1).

causes_true(move(Rover, From, To), at(Rover, To), true).
causes_false(move(Rover, From, To), at(Rover, From), true).
causes_val(move(Rover, From, To), energy_level(Rover), E, E is energy_level(Rover)-1).

causes_true(explore(_Rover, Area), explored(Area), true).
causes_val(explore(Drone, Area), energy_level(Drone), E, E is energy_level(Drone)-1).

causes_true(collect(_Rover, Resource, _Location), collected(Resource), true).
causes_false(collect(_Rover, Resource, Location), resource_at(Resource, Location), true).
causes_val(collect(Rover, _Resource, _Location), energy_level(Rover), E, E is energy_level(Rover)-1).

causes_false(handle_sandstorm(Area), sandstorm_at(Area), true).
```

IndiGolog: Sensing and Exogenous actions

```
senses(detect_no_obstacle(Drone, Area), traversable(Area)).  
prim_action(detect_no_obstacle(Drone, Area)):- drone(Drone), area(Area).  
poss(detect_no_obstacle(Drone, Area), and(at(Drone, Area), scanned(Area))).
```

```
exog_action(sandstorm(Area)):- area(Area).  
causes_true(sandstorm(Area), sandstorm_at(Area), true).  
causes_false(sandstorm(Area), scanned(Area), true).  
causes_false(sandstorm(Area), traversable(Area), true).
```

IndiGolog: Procedures

```
proc(drone_scan_area(Drone, To),  
    [fly(Drone, From, To), scan(Drone, To), detect_no_obstacle(Drone, To)]).  
  
proc(safe_move(Rover, To),  
    [drone_scan_area(Drone, To),  
     if(traversable(To),  
        move(Rover, From, To), [])]).  
  
proc(explore_and_collect(Location, Resource),  
    [safe_move(Rover, Location),  
     if(neg(explored(Location)), explore(Rover, Location), []),  
     if(resource_at(Resource, Location), collect(Rover, Resource, Location), [])]).
```

IndiGolog: Tasks

```
%Controller to collect a generic resource
proc(control(collect_resource),
  if(some(r, neg(collected(r))),
    pi([l,r], explore_and_collect(l,r),
      [])).

% Controller to collect all resources
proc(control(collect_all),
  while(some([r,l], (and(resource_at(r,l), neg(collected(r))))),
    [pi([l,r], explore_and_collect(l, r))])).

% Controller to collect all resources and handle exogenous events
proc(control(collect_all_exo),
  [prioritized_interrupts([
    interrupt(some(l, sandstorm_at(l)), pi(l, [handle_sandstorm(l), scan(Drone, l), detect_no_obstacle(Drone, l)])),
    interrupt(some([r,l], (and(resource_at(r,l), neg(collected(r))))), pi([l,r], explore_and_collect(l,r))),
    interrupt(true, ?(wait_exog_action))
  ])]).
```

IndiGolog: Task 1 solution

```
PROGRAM: Program has executed to completion!! History done:
      [collect(rovers, res1, loc1), explore(rovers, loc1), move(rovers, base1, loc1), e(detect_no_obstacle(drone1, loc1), true),
detect_no_obstacle(drone1, loc1), scan(drone1, loc1), fly(drone1, base1, loc1)]
END: Execution finished. Closing modules...
END: INDIGOLOG is finishing...
END: Finalizing PROJECTOR...
END: PROJECTOR was finalized successfully.
END: Finalizing ENVIRONMENT MANAGER...
EM(1): EM completed with 6 executed actions
END: ENVIRONMENT MANAGER was finalized successfully.
END: Everything finished - HALTING TOP-LEVEL CONTROLLER
true.
```

IndiGolog: Task 2 solution

```
PROGRAM: Program has executed to completion!! History done:
      [collect(rovers1,res2,loc2),explore(rovers1,loc2),move(rovers1,loc1,loc2),e(detect_no_obstacle(drone1,loc2),true)
,detect_no_obstacle(drone1,loc2),scan(drone1,loc2),fly(drone1,loc1,loc2),collect(rovers1,res1,loc1),explore(rovers1,loc1)
,move(rovers1,base1,loc1),e(detect_no_obstacle(drone1,loc1),true),detect_no_obstacle(drone1,loc1),scan(drone1,loc1),fly(
drone1,base1,loc1)]
END: Execution finished. Closing modules...
END: INDIGOLOG is finishing...
END: Finalizing PROJECTOR...
END: PROJECTOR was finalized successfully.
END: Finalizing ENVIRONMENT MANAGER...
EM(1): EM completed with 12 executed actions
END: ENVIRONMENT MANAGER was finalized successfully.
END: Everything finished - HALTING TOP-LEVEL CONTROLLER
true.
```

IndiGolog: Task 3 solution

```
PROGRAM: Program has executed to completion!! History done:
      [collect(rover1,res2,loc2),explore(rover1,loc2),move(rover1,loc1,loc2),e(detect_no_obstacle(drone1,loc2),true),detect_no_obstacle(drone1,loc2),scan(drone1,loc2),handle_sandstorm(loc2),sandstorm(loc2),e(detect_no_obstacle(drone1,loc2),true),detect_no_obstacle(drone1,loc2),scan(drone1,loc2),fly(drone1,loc1,loc2),collect(rover1,res1,loc1),explore(rover1,loc1),move(rover1,basel,loc1),e(detect_no_obstacle(drone1,loc1),true),detect_no_obstacle(drone1,loc1),scan(drone1,loc1),fly(drone1,basel,loc1)]
END: Execution finished. Closing modules...
END: INDIGOLOG is finishing...
END: Finalizing PROJECTOR...
END: PROJECTOR was finalized successfully.
END: Finalizing ENVIRONMENT MANAGER...
EM(1): EM completed with 15 executed actions
END: ENVIRONMENT MANAGER was finalized successfully.
END: Everything finished - HALTING TOP-LEVEL CONTROLLER
true.
```


Thanks for the attention!

