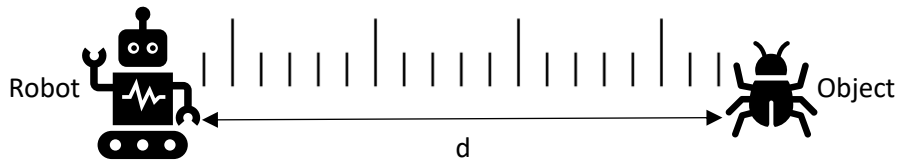


# EAS-502 Project 1

Team Members:

1. Nabeel Khan 56
2. Vijaya Rana 106



The **experiment starts at  $t = 0$  ( $d > 0$ )**. Let  $T$  be the time at which the distance between Robot and object is zero ( $d=0$ ). Experiment ends when the **robot and the object land on the same spot, or when they cross each other**.

We define:

$A_d$ : The event that **initially** the robot and the object are  $d$  units apart

$B_d$ : The event that **after one second** the robot and object are  $d$  units apart

Strategy 1: At each unit of time, the robot will move 1 unit toward the object regardless of the object movement.

## Analytical Solution

For the initial distance  $d$  there are 3 cases which are mentioned below considering robot moves 1 unit towards object:

Case	Object movement	Robot movement	Distance	Probability
1	Left	Right	$d-2$	$p$
2	Right	Right	$d$	$p$
3	Stationary	Right	$d-1$	$1-2p$

Where  $p$  = Probability of movement of Object

Breaking  $E[T|A_d]$  by using Total expectation theorem for above 3 cases:

$$E[T|A_d] = P(B_d|A_d)E[T|A_d \cap B_d] + P(B_{d-1}|A_d)E[T|A_d \cap B_{d-1}] + P(B_{d-2}|A_d)E[T|A_d \cap B_{d-2}] \rightarrow \text{Equation 1}$$

For simplification considering:  $E[T|A_d] = E_d$  &  $P_{OM}=p$

Simplifying further Equation 1

$$E_d = p(1+E_d) + (1-2p)(1+E_{d-1}) + p(1+E_{d-2})$$

Rearranging for  $E_d$

$$E_d = (p + (1-2p)(1+E_{d-1}) + p(1+E_{d-2})) / (1-p)$$

➔ This is General term for the Strategy 1

We calculate  $E[T|A_1]$  using the General term for the Strategy 1 and then we used this result to compute  $E[T|A_2]$ . We'll use MATLAB to calculate  $E[T|A_d]$  for the relevant values of  $d$ .

$$E_1 = 1 - p + p(E_d) + p$$

$$E_2 = (2 - 3p) / ((1 - p)^2)$$

Now using this we can calculate  $E_3$  to  $E_{19}$

MATLAB Code for Strategy 1:

```
function [final_expected_vals] = strategy_1()
% Function to calculate expected values of time for P_om from .1 to .5

final_expected_vals = [];

% Using P_om from .1 to .5
for p_om = (1:5)/10

    % Starting with the E1 and E2 calculated manually using general term
    exp_vals = [1/(1-p_om), (2-3*p_om)/((1-p_om)*(1-p_om))];

    % Calculating E3 to E19 using general equation
    for d = 3:19
        E_d = (p_om + (1-2*p_om)*(1+ exp_vals(d-1)) + p_om*(1+ exp_vals(d-2)))/(1-p_om);
        exp_vals(d) = E_d;
    end

    % Now calculating the expected value using conditional expectation
    % Using pmf of d (uniform distribution with Pd = 0.1)
    expected_total = 0;
    for d = 10:19
        expected_total = expected_total + 0.1*exp_vals(d);
    end

    disp(expected_total);
    final_expected_vals(end + 1) = expected_total;
end
end
```

Analytical Result for Strategy 1:

Probability of Object Movement ( $P_{OM}$ or $p$ )	Expected Value of Time ( $E_T$ )
0.1	14.60
0.2	14.70
0.3	14.80
0.4	14.90
0.5	15.00

Strategy 3: At each unit of time, the robot will move 1 unit toward the object if the object moves to either left or right, and the robot will stop if the object stops.

Analytical Solution:

For the initial distance  $d$  there are 3 cases which are mentioned below considering robot moves 1 unit towards object:

Case	Object movement	Robot movement	Distance	Probability
1	Left	Right	$d-2$	$p$
2	Right	Right	$d$	$p$
3	Stationary	Stationary	$d$	$1-2p$

Where  $p$  = Probability of movement of Object

Breaking  $E[T|A_d]$  by using Total expectation theorem for above 3 cases:

$$E[T|A_d] = P(\text{Object moves right})E[T|A_d \cap B_d] + P(\text{Object stationary})E[T|A_d \cap B_d] + P(\text{Object moves left})E[T|A_d \cap B_{d-2}]$$

For simplification considering  $E[T|A_d] = E_d$  &  $P_{OM}=p$

Simplifying further:

$$E_d = p(1 + E_{d-2}) + p(1 + E_d) + (1-2p)(1 + E_d)$$

Now after solving for  $E_d$ , we get

$$E_d = (1 + pE_{d-2})/p$$

→ This is General term for the Strategy 3

We calculate  $E[T|A_1]$  using the General term for the Strategy 3 and then we used this result to compute  $E[T|A_2]$ . We'll use MATLAB to calculate  $E[T|A_d]$  for the relevant values of  $d$ .

$$E_1 = 1/p$$

$$E_2 = 1/p$$

Now using this we can calculate  $E_3$  to  $E_{19}$

### MATLAB Code for Strategy 3:

```
function [final_expected_vals] = strategy_3()
% Function to calculate expected values of time for P_om from .1 to .5

final_expected_vals = [];

% Using P_om from .1 to .5
for p_om = (1:5)/10

    % Starting with the E1 and E2 calculated manually
    exp_vals = [1/(p_om), 1/(p_om)];

    % Calculating E3 to E19 using general term
    for d = 3:19
        E_d = (1 + (p_om)*(exp_vals(d-2)))/(p_om);
        exp_vals(d) = E_d;
    end

    % Now calculating the expected value using conditional expectation
    % Using pmf of d (uniform distribution with Pd = 0.1)
    expected_total = 0;
    for d = 10:19
        expected_total = expected_total + 0.1*exp_vals(d);
    end

    disp(expected_total);
    final_expected_vals(end + 1) = expected_total;
end
end
```

### Analytical Result for Strategy 3:

Probability of Object Movement (P <sub>OM</sub> Or p)	Expected Value of Time (E <sub>T</sub> )
0.10	75.00
0.20	37.50
0.30	25.00
0.40	18.75
0.50	15.00

Strategy 2\*: At each unit of time, the robot will move 1 unit toward the object (with the probability of  $1.5 P_{OM}$  or will stop (with the probability of  $1-1.5P_{OM}$ ) regardless of the object movement.

For the initial distance d there are 6 cases which are mentioned below considering robot moves 1 unit towards object:

Case	Robot movement	Object movement	Distance	Probability
1	Still	Left	d-1	(1-q)p
2	Still	Right	d+1	(1-q)p
3	Still	Still	d	(1-q)(1-2p)
4	Right	Left	d-2	qp
5	Right	Right	d	qp
6	Right	Still	d-1	q(1-2p)

Where p = Probability of movement of Object, and q = Probability of movement of robot

$$E[T|A_d] = P(\text{Robot still, Object moves Left})E[T|A_d \cap B_{d-1}] + P(\text{Robot still, Object moves Right})E[T|A_d \cap B_{d+1}] + \\ P(\text{Robot still, Object Still})E[T|A_d \cap B_d] + P(\text{Robot moves right, Object moves Left})E[T|A_d \cap B_{d-2}] + \\ P(\text{Robot moves right, Object moves Right})E[T|A_d \cap B_d] + P(\text{Robot moves right, Object Still})E[T|A_d \cap B_{d-1}]$$

Simplifying above equation considering  $E[T|A_d] = E_d$

$$E_d = (1+(p+q-3pq) E_{d-2} + (3 pq-2p-q) E_{d-1} + (pq)E_{d-3} )/p(q-1)$$

Where  $q=1.5p$ , solving we get

$$E_d = (1+(2.5p-4.5p^2)E_{d-2} + ((4.5*p^2) - 3.5*p)E_{d-1}+(1.5 p^2) E_{d-3}))/p(1.5p- 1) \rightarrow \text{This is } \underline{\text{General term for the Strategy 2}}$$

Using General term for the Strategy 2 we calculate  $E_1, E_2, E_3$  for respective values of p shown in table

	$E_1$	$E_2$	$E_3$
p=0.1	7.109830201	13.74703778	20.41566273
p=0.2	3.832148359	7.090836764	10.4353403
p=0.3	2.796251249	4.870194275	7.130718951
p=0.4	2.349754291	3.736455736	5.51786687
p=0.5	2.194335081	2.971675407	4.664041954

## MATLAB Code for Strategy 2:

```
function [final_expected_vals] = strategy_2()
% Function to calculate expected values of time for P_om from .1 to .5

initial_E = [7.109830200957157 13.747037779905098 20.415662725586326
3.8321483594592816 7.090836763705904 10.435340300715005
2.7962512487710653 4.870194275499013 7.130718950732399
2.3497542908541056 3.736455736129949 5.5178668695576
2.1943350814194544 2.9716754070972726 4.664041954066908];

final_expected_vals = [];

% Using P_om from .1 to .5
for iter_count = (1:5)

    % Using P_om from .1 to .5
    p_om = iter_count/10;

    % Starting with the E1, E2, and E3 calculated manually
    E = initial_E(iter_count,:);

    % Calculating E4 to E19 using general equation
    for d = 4:19
        E(d)=(1+(2.5*p_om-4.5*p_om^2)*E(d-2)+((4.5*p_om^2)-3.5*p_om)*E(d-1)
        +(1.5*(p_om^2)*E(d-3)))/(p_om*(1.5*p_om - 1));
    end

    % Now calculating the expected value using conditional expectation
    % Using pmf of d (uniform distribution with Pd = 0.1)
    expected_total = 0;
    for d = 10:19
        expected_total = expected_total + 0.1*E(d);
    end

    disp(expected_total);
    final_expected_vals(end + 1) = expected_total;
end
end
```

## Analytical Result for Strategy 2:

Probability of Object Movement (P <sub>OM</sub> Or p)	Expected Value of Time (E <sub>T</sub> )
0.10	97.082
0.20	48.767
0.30	32.678
0.40	24.651
0.50	19.856

## Conclusion

We used simulation for 10000 iterations to **arrive at the same results** as concluded in the table below

Strategy	P <sub>om</sub>	Analytical Expected Value	Simulation		
			Iterations	Total Time	Simulated Expected Value
Stg_1	0.10	14.600	10000	146042	14.6042
Stg_1	0.20	14.700	10000	146760	14.676
Stg_1	0.30	14.800	10000	147276	14.7276
Stg_1	0.40	14.900	10000	149199	14.9199
Stg_1	0.50	15.000	10000	149503	14.9503
Stg_2	0.10	97.082	10000	967419	96.7419
Stg_2	0.20	48.767	10000	489432	48.9432
Stg_2	0.30	32.678	10000	327241	32.7241
Stg_2	0.40	24.651	10000	245996	24.5996
Stg_2	0.50	19.856	10000	198819	19.8819
Stg_3	0.10	75.000	10000	749603	74.9603
Stg_3	0.20	37.500	10000	375690	37.569
Stg_3	0.30	25.000	10000	251017	25.1017
Stg_3	0.40	18.750	10000	188280	18.828
Stg_3	0.50	15.000	10000	150856	15.0856

## Python Code for simulation

```
import numpy as np
import random
import pandas as pd

table_results = []

for p_om in [.1, .2, .3, .4, .5]:
    robot_position = 0
    obj_position = np.random.choice(range(10,20))
    robot_mvmts = np.array([0,1])
    obj_mvmts = np.array([-1,0,1])
    obj_mvmt_probs = np.array([p_om, 1-2*p_om, p_om])
    robot_mvmt_probs = np.array([1-1.5*p_om, 1.5*p_om])

    # strategy 1
    stg_1_times = []
```

```

for sim_count in range(10000):
    time_count = 0
    while robot_position < obj_position:
        robot_position += 1
        obj_position += np.random.choice(obj_mvmts, 1,p=obj_mvmt_probs)[0]
        time_count += 1
    robot_position = 0
    obj_position = np.random.choice(range(10,20))
    stg_1_times.append(time_count)
print(sum(stg_1_times)/len(stg_1_times))
table_results.append(['Stg_1', p_om,sum(stg_1_times) ])

# strategy 2
stg_2_times = []
for sim_count in range(10000):
    time_count = 0
    while robot_position < obj_position:
        robot_position += np.random.choice(robot_mvmts,
1,p=robot_mvmt_probs)[0]
        obj_position += np.random.choice(obj_mvmts, 1,p=[p_om, 1-2*p_om,
p_om])[0]
        time_count += 1
    robot_position = 0
    obj_position = np.random.choice(range(10,20))
    stg_2_times.append(time_count)
print(sum(stg_2_times)/len(stg_2_times))
table_results.append(['Stg_2', p_om,sum(stg_2_times) ])

# strategy 3
stg_3_times = []
for sim_count in range(10000):
    time_count = 0
    while robot_position < obj_position:
        obj_movement = np.random.choice([-1,0,1], 1,p=[p_om, 1-2*p_om,
p_om])[0]

```



```
    obj_position += obj_movement
    robot_position += abs(obj_movement)
    time_count += 1
robot_position = 0
obj_position = np.random.choice(range(10,20))
stg_3_times.append(time_count)
print(sum(stg_3_times)/len(stg_3_times))
table_results.append(['Stg_3', p_om, sum(stg_3_times) ])
```