

**CSCI-8920**

# **WarLight Bot : A Gaming Problem in a Unique Environment**

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# Agenda

## Introduction and Goals

- Rules
- Goals

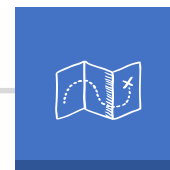


## Performance



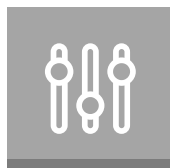
## Analysis and Methodology

- Analysis
- Framework
- POMDP – Search Tree
- Bayesian Games



## Challenges and Solutions

- Memory issues
- Time issues



## Questions



## Limitations and Future Improvements

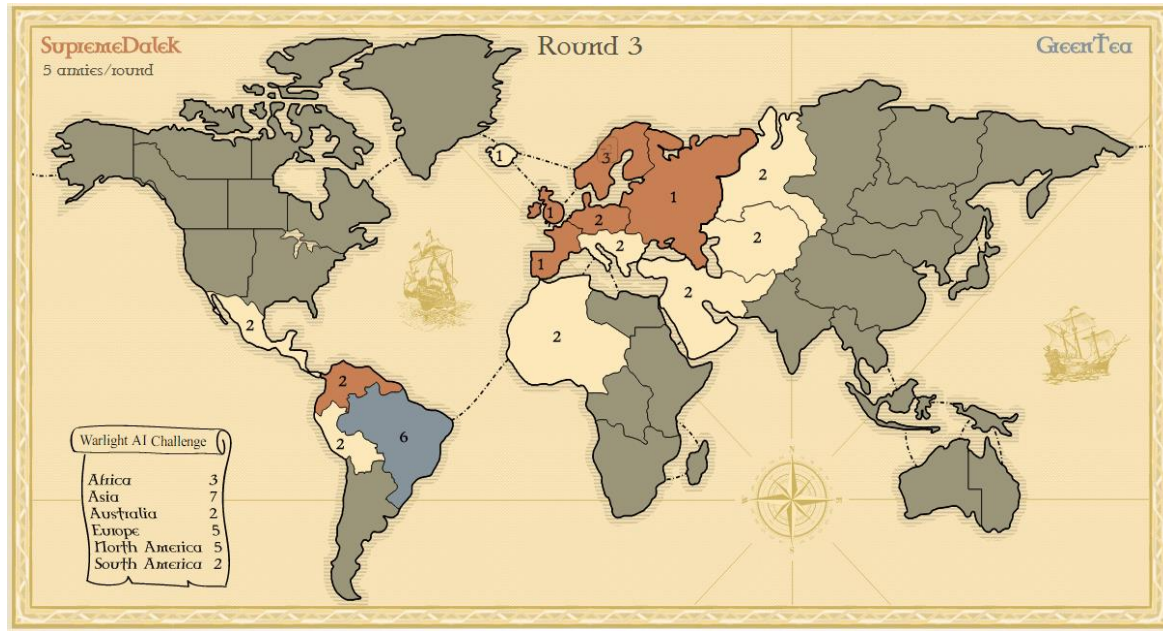


# Introduction and Goals



# Introduction and Project Goals

## Introduction



## Project Goals

- Analysis of the overall game and finding the impacting parameters
- Come up with best suitable architecture for game playing
- Create a BOT, which efficiently and effectively work in the given environment.

# Analysis and Methodology



# Analysis

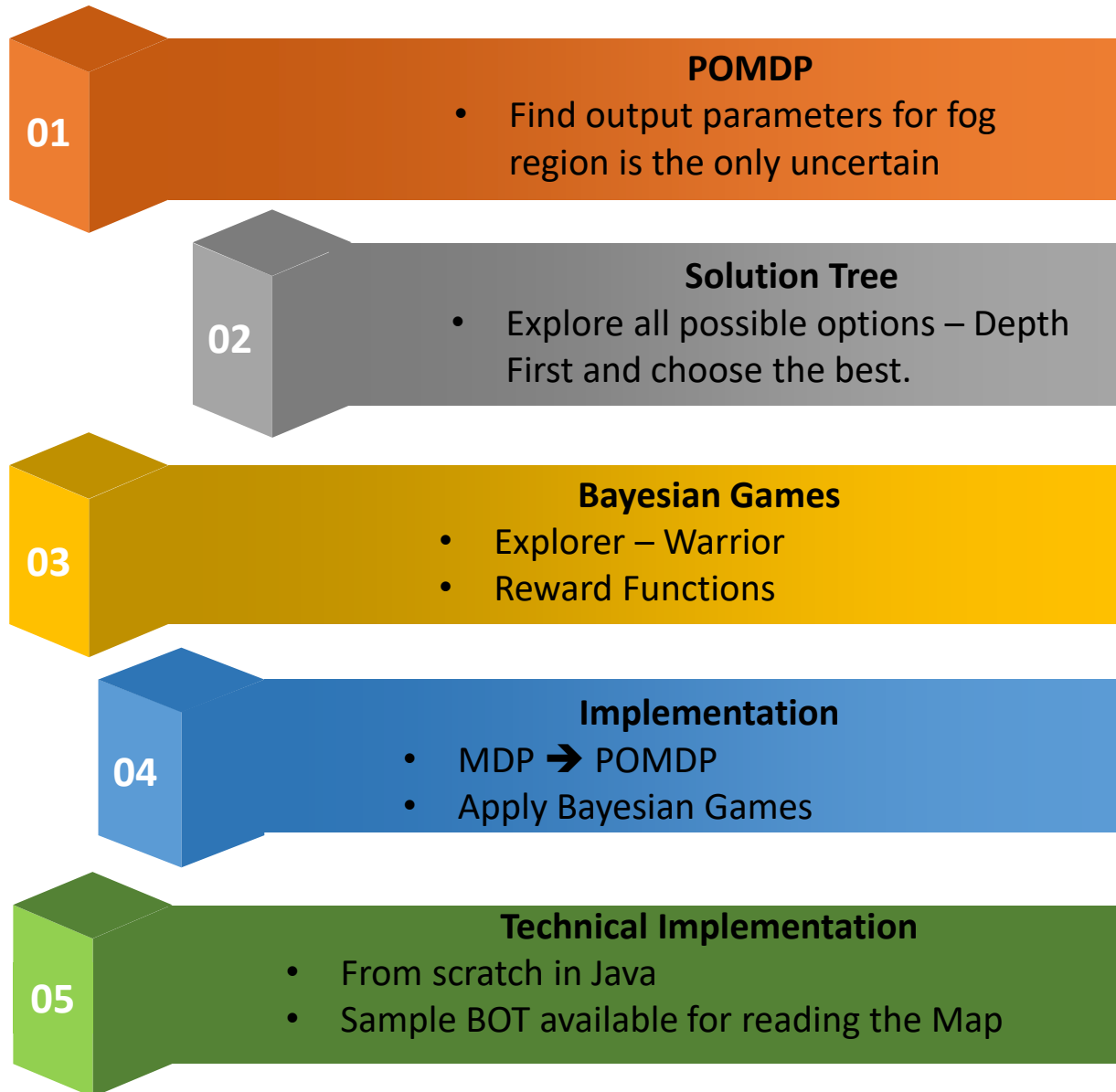
## **Input Parameters :**

- Neighborhood Regions
- Actions in Neighborhood Regions
- Number of Rounds

## **Output Parameters:**

- Overall Map
- Army of the Opponent per turn

# Methodology





# POMDP

POMDP := < State Space(S), Set of Actions(A), T(Transition Function), Observation( $\Omega$ ), Reward Function (R) , OC (Optimality Criteria)>

**S** : Overall Map with information of each region and its properties (Army on the Region, Neighbors, Owner)

Fogg region is uncertain.

**A** : Set of actions in  $A'$  (Set should be considered sequentially)

Where,  $A' = \{ \text{Deploy, Attack, Transfer} \}$

# POMDP

**T** : (3 different functions for each action)

**Deployment** : Add the armies to that of the region

**Attack** : Army after conflict in Destination =

(Destination Region Army – 60% of the Attacking Army) +  
(Attacking Army – 70% of the Source Region Army)

Source Army After Conflict = Source Army – Attacking Army

**Transfer** : Move from one region to another.

**$\Omega$**  : Input Variables

- Number of Rounds
- Neighborhood Region



- Actions of the opponents in the Neighborhood

# POMDP

**R : Bayesian Games Impact**

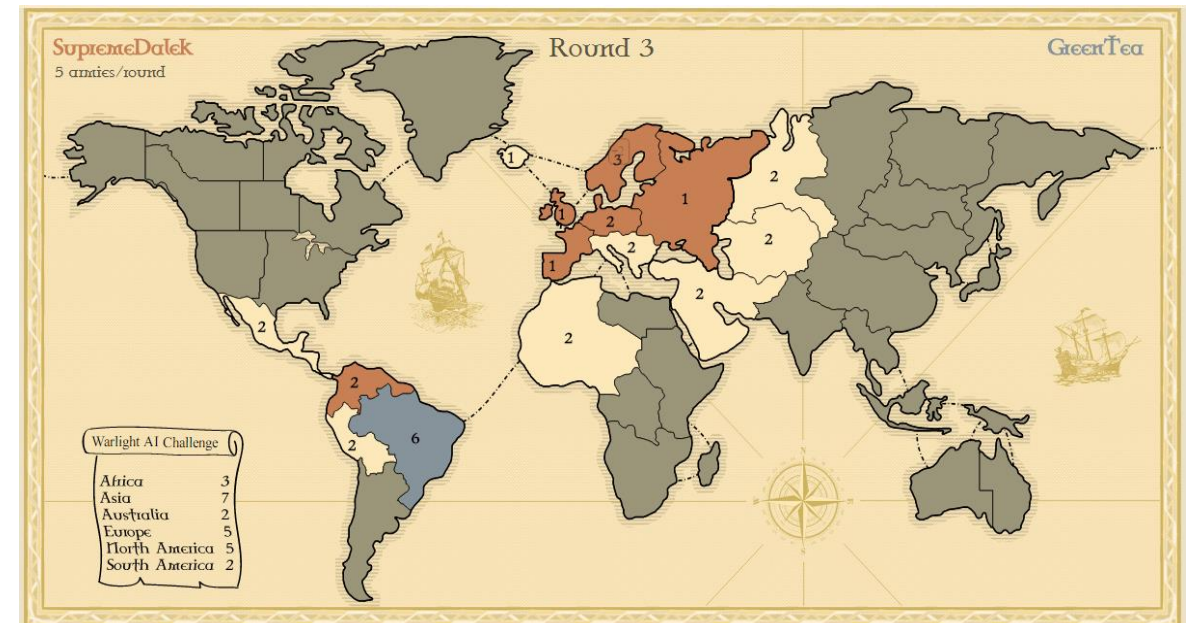
Explorer = (Army Strength – Army In Mid Regions)  
 \* ( Super Region size to reward ratio \* No. of regions) ^ 2  
 \* Armies Per Turn / 100

Warrior = (Army Strength – Army In Mid Regions)  
 \* (Sum of Superiority with opponent's army per region)  
 \* ( Super Region size to reward ratio \* No. of regions) ^ 2  
 \* Armies Per Turn / 100

**OC : Capture all the territories.**

# Solution Tree in POMDP

- Solution Tree instead of Value Iteration – More suitable.
- Each node is the State of the Map.
- Iterate all possible combinations. Depth First Tree Exploration.
- Best Reward is the Solution.



# Performance



# Performance

- Let's have a demo !
- Working well in initial states.
- Glitches start after some rounds.
- Completely stops after some more !

# Challenges and Solutions



# Challenges And Solutions

## Error dump ↴

Java HotSpot(TM) 64-Bit Server VM warning: No monotonic clock was available - timed services may be adversely affected if the time-of-day clock changes

Exception in thread "main" java.lang.OutOfMemoryError: Java heap space

```
at java.util.LinkedList.linkLast(LinkedList.java:142)
at java.util.LinkedList.add(LinkedList.java:338)
at main.Region.addNeighbor(Region.java:52)
at main.Map.getMapCopy(Map.java:81)
at bot.BotState.(BotState.java:57)
at mdp.beans.WarlightMDPSkeleton.(WarlightMDPSkeleton.java:47)
at mdp.WarlightMDPEExecution.createTree(WarlightMDPEExecution.java:274)
at mdp.WarlightMDPEExecution.createTree(WarlightMDPEExecution.java:312)
at mdp.WarlightMDPEExecution.createTree(WarlightMDPEExecution.java:312)
at mdp.WarlightMDPEExecution.createTree(WarlightMDPEExecution.java:312)
```

01

**Out Of Memory** Issues due to huge search space :

Removed each state after successor is created.

Just keep leaf nodes with through actions.

02

**Timeout** : 2 seconds limit for a move.

Prune nodes after deployment.

Choose the current best, when near to timeout.

03

**Tuning Reward Function:**





Updating to match the strategies.



# Limitations and Future Work



# Limitations and Future Improvements

-  Time out issues : Not able to complete game due to huge time complexity into the given environment.
-  Need to drop some important features.
-  Parallel exploration of each node would help the performance. - Multi threading approach in Java.
-  Centralized I-POMDP can be a better approach then the given solution.

**Thank you!**  
**Questions?**

