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An **Ant Colony** based
Algorithm
for **Test Case Prioritization**
with Precedence



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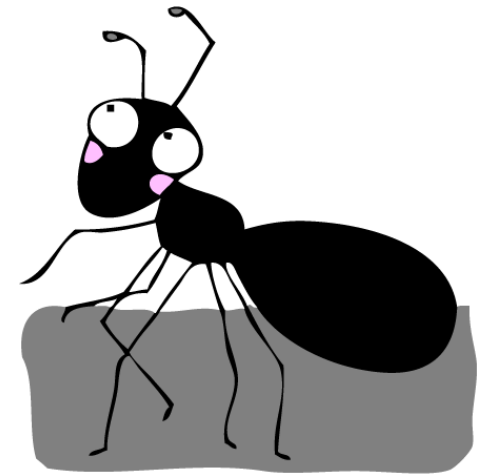


The following topics will be discussed

- Introduction
- Problem definition
- Problem encoding
- The proposed ACO-based algorithm
- Conclusions and future works



INTRODUCTION





Test Case Prioritization

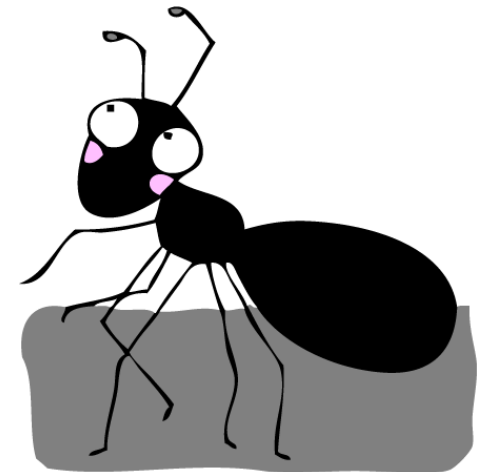
- The more important ones has to be tested before
 - What is more important for the client?
 - Are there any constraints for the prioritization?

ACO applied to TCP problem

- Few works on TCP
- Precedence of test cases not considered yet
- Application in other problems in our group
- A new approach considering the precedence of test cases



PROBLEM DEFINITION



Requirements

- Set **R** of requirements
 - **N** elements
- Attributes
 - *importance_i*
 - *volatility_i*

Test Cases

- Set **C** of test cases

- **M** elements

- Attributes

- *precedence_j*

- *coverage_j*

- *executionTime_j*

- $score_j = \sum_{\forall \text{ requirement } i \in coverage_j} ((importance_i * weight1) + (volatility_i * weight2)),$

Mathematical Formulation

$$\text{Maximize } \sum_{j=1}^M \left(\frac{\text{score}_j}{\text{executionTime}_j} * P_j \right)$$

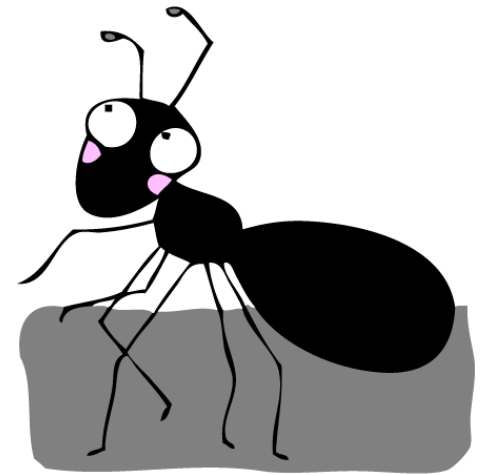
Subject to:

$$\forall t_{j1}, t_{j2} \in C, \quad \left(\text{precedence}_{t_{j2}} = t_{j1} \right) \rightarrow (q_{t_{j1}} < q_{t_{j2}})$$

- Where $P_j = M - q_j + 1$
- q_j is the position of test case j in the ordered suite



PROBLEM ENCODING



Overview

- Directed graph $G = (V, E)$
- Each test case represents a vertice on the graph
 - V has M elements
- All vertices are connected with all others
- Pheromone equally distributed

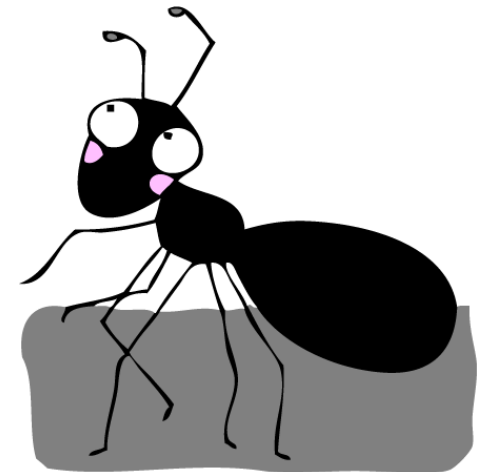
The Proposed Approach

- Each **ant** has the following information
 - nextNode
 - visitedNodes
 - allowedNodes
- Heuristic Function

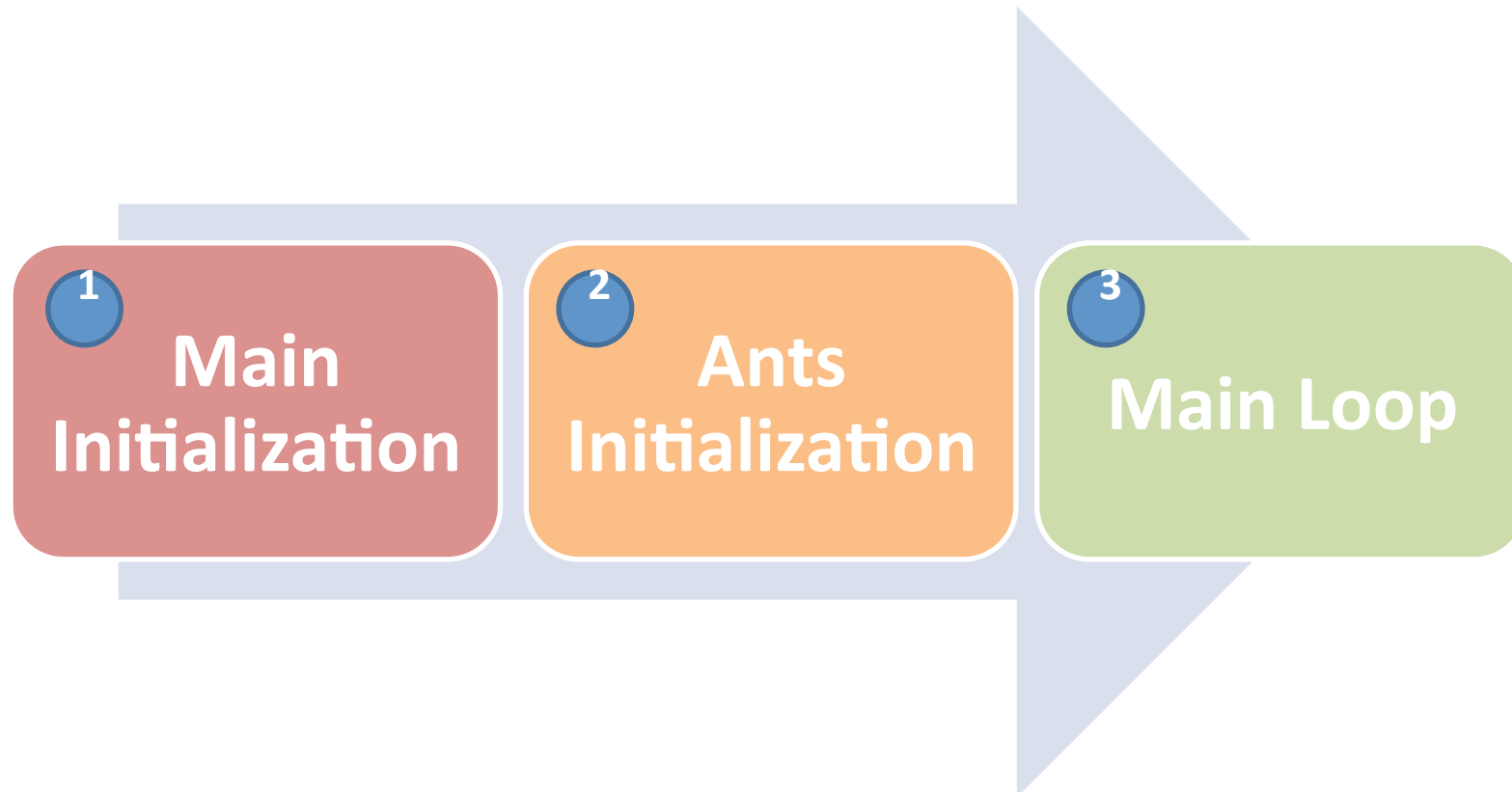
$$\frac{score_j}{executionTime_j}$$



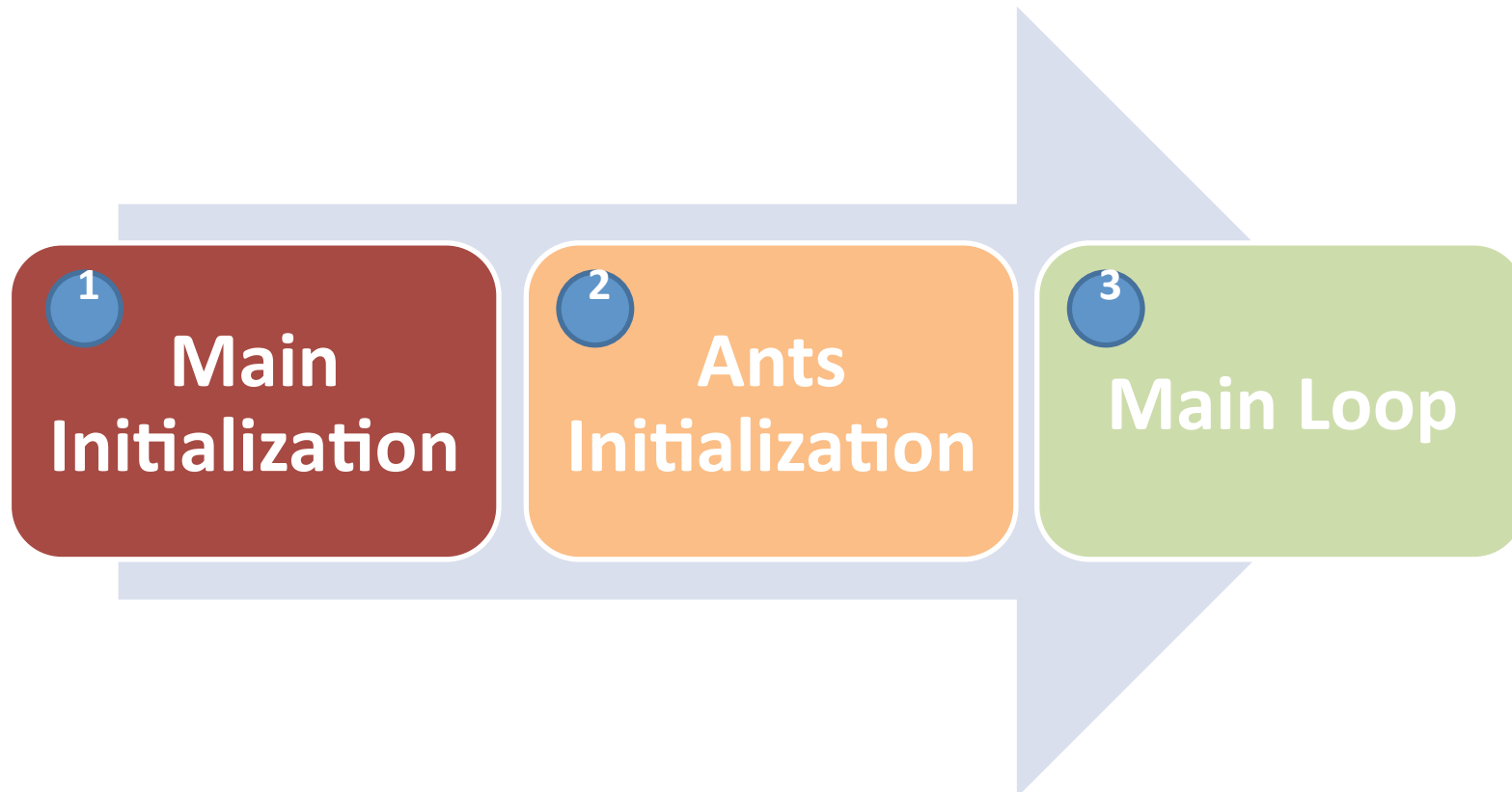
THE PROPOSED ACO-BASED ALGORITHM



Steps of the Algorithm



Steps of the Algorithm



MAIN_INITIALIZATION

ITERATION = 0

Read test case precedence information

Generate directed graph

Initialize pheromone

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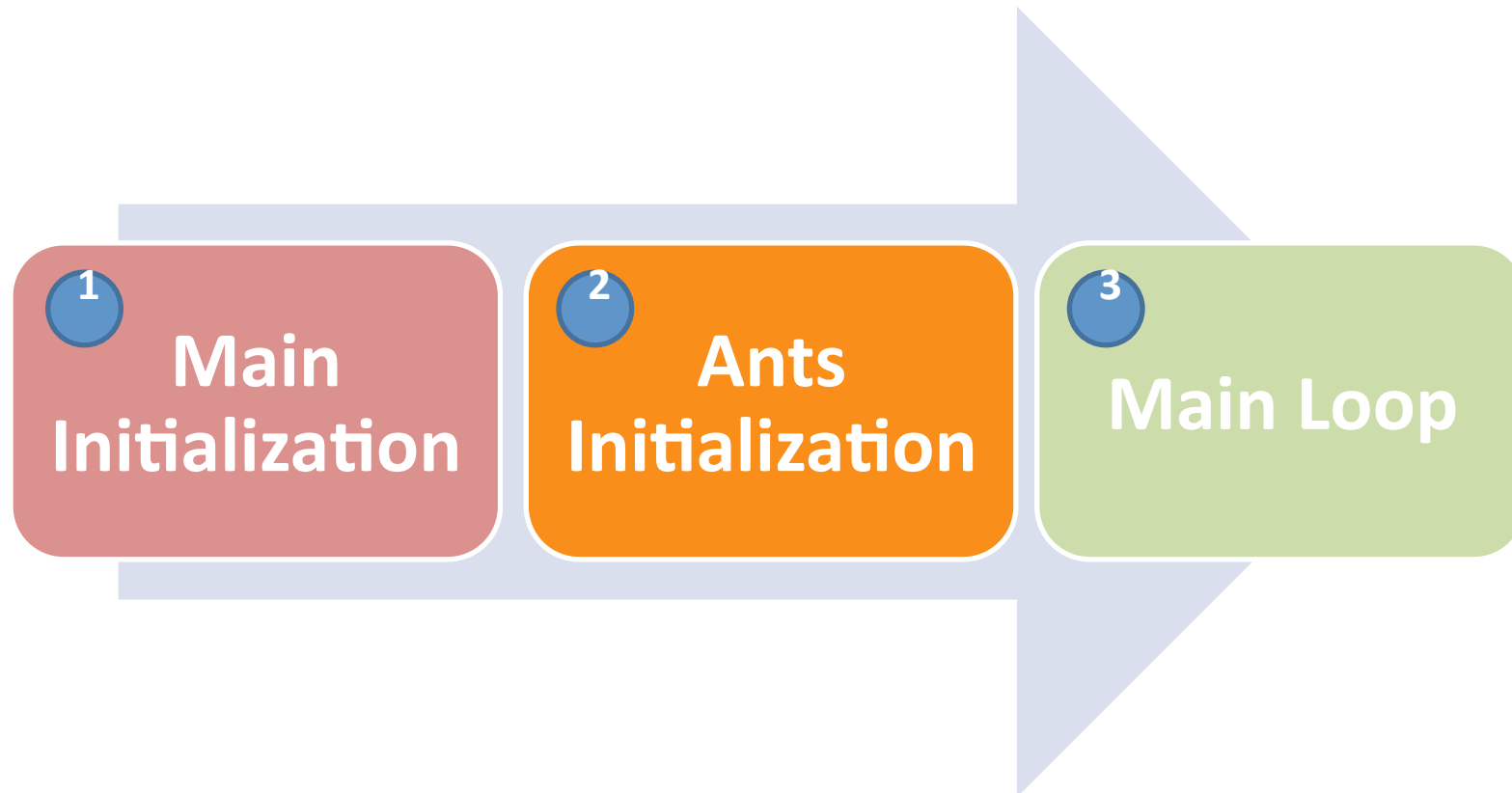
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Steps of the Algorithm



ANTS_INITIALIZATION

FOR ALL ants

FOR ALL vertices t_j of V , $visited_j \leftarrow \text{False}$

$ant_k.allowedNodes = \text{UPDATE_ALLOWED_NODES}()$

$ant_k.nextNode = \text{FIND_INITIAL_NODE}()$

$ant_k.visitedNode.add(nextNode)$

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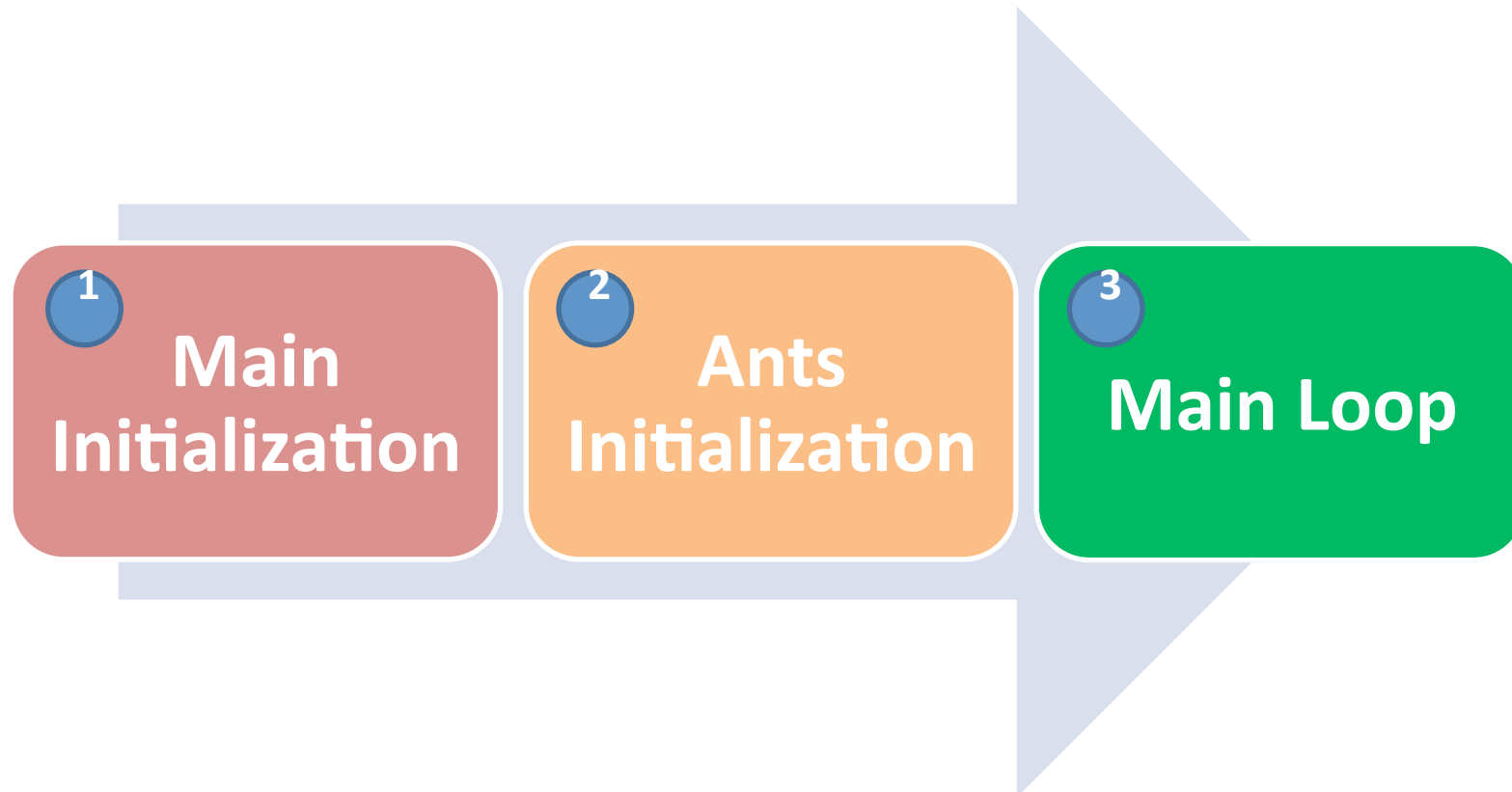
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Steps of the Algorithm



MAIN_LOOP

FOR EACH ant_k

WHILE $\text{ant}_k.\text{allowedNodes.size()} > 0$

$k = \text{ant}_k.\text{actualNode}$

$\text{ant}_k.\text{nextNode} = \text{ant}_k.\text{FIND_NEXT_NODE}()$

$j = \text{ant}_k.\text{actualNode}$

$\text{ant}_k.\text{visitedNodes.add}(\text{ant}_k.\text{nextNode})$

$\text{ant}_k.\text{allowedNodes} = \text{UPDATE_ALLOWED_NODES}()$

Update pheromone in edge (k,j) , with

$$\tau_{kj} = (1 - \varphi) \cdot \tau_{kj} + \varphi \cdot \tau_0$$

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MAIN_LOOP_FINALIZATION

```
currentSolution = EVALUATE_BEST_SOLUTION()
```

```
IF ((bestSolution.value() is null)
```

```
    or (bestSolution.value() < currentSolution.value())) THEN
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    bestSolution = currentSolution
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The bestSolution variable is the result of the algorithm

ant_k.UPDATE_ALLOWED_NODES()

```
antk.allowedNodes.clear()
```

```
FOR ALL vertices  $t_i \in V$ 
```

```
    IF ( $t_i$  respects the precedence constraint and is not yet in solution)
```

```
        antk.allowedNodes.add( $t_i$ )
```

ant_k.UPDATE_ALLOWED_NODES()

ant_k.allowedNodes.clear()

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IF (t_i respects the precedence constraint and is not yet in solution)

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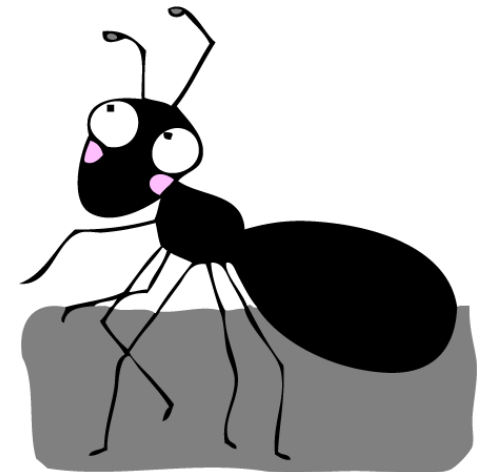
ant_k.FIND_NEXT_NODE()

Move ant k to a vertex t_i with probability p_{ij}^k or considering $\max(\tau_{ij} \cdot w_j^\beta)$,
considering only nodes in allowedNodes set

Return t_i



CONCLUSIONS AND FUTURE WORKS



Conclusions

- Currently
 - Implementation phase
 - Preliminary results not already to present
- Future
 - Evaluate and compare to other search-based algorithms



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