# Advanced Data Structures with Java: Decision-based Travel Improvement

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## **Executive Summary**

Work is summarized that demonstrates heuristic-based reduction of distance traveled by traversing an arbitrary circuit in a weighted graph. A java code template is provided by UC San Diego faculty. The skeleton code is comprised of 262 files in 51 directories. Development excutes with Java JDK 1.8.0\_60-b27 in an Eclipse Version: Mars.1 Release (4.5.1) environment. Version control executes with git version 1.9.5.msygit.0. After the decision-based heuristic is successfully implemented along with implementing several search algorithms, the code is 273 files with 51 directories. Code development for the heuristic decision-based routing method includes the addition of four methods in MapGraph.java of the package roadgraph.

## **Project Summary**

The project delivers (1) geographic routing between start and destination locations and (2) visualization of the graph nodes visited during execution of several search algorithms. The code demonstrates class design that implements five constructs: (1) Abstract Data Type (ADT), (2) Breadth First Search (BFS), (3) Dijkstra Search, (4)  $A^*$  Search, and (5) decision-based heuristic for returning shortest distance recorded for a subset of route permutations. The ADT is a graph that stores data using a HashMap. Geographic location data is stored in an object that is named GeographicPoint (GP) and that extends the Object.Number.Double class. Routes and visited nodes are visualized using the Google Map API. The heuristic decision based extension returns route optimization to the console.

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## Introduction

A graph is a construction that contains nodes and edges. Nodes are objects that contain data, and edges represent directed connections between nodes. In the context of geographic map data, a GP represents a node and roads represent edges connecting these nodes. Developed code is in MapGraph.java, mapVertex.java, and mapEdge.java classes of the roadgraph package. Figure 1 shows an UML diagram for five of the seven classes in roadgraph package. The remaining two classes are shown in figure 2.



Figure 1: This figure shows an UML class diagram for the roadgraph package, which includes the class MapGraph.java, mapVertex.java, and mapEdge.java. The latter two classes are shown in figure 2.

The methods implementing the heuristic decision-based reduction of distance traveled is described in the section Methods. The implemented search algorithms and related methods for the classes MapGraph.java, mapVertex.java, and mapEdge.java also are described in the Methods section.



Figure 2: This figure shows an UML object diagram for the roadgraph package that depicts mapVertex.java, and mapEdge.java.

## Methods

```
The pseudocode for BFS algorithm is:
```

```
bfs(start, destination, Consumer<GP>):
Initialization of structures
Enqueue GP in queue and add to list of visited GP's
while queue is not empty:
    dequeue GP from front of queue as current
    if current == destination, then return parent map
    for each of current's unvisited neighbors, n:
        add n to visited set
        add current as n's parent in parent map
        enqueue n to back of queue
if parent map not returned, then there is no path
```

Consumer<GP> is a hook that passes nodes visited during BFS search to the class that provides a visual representation of the visited nodes.

The pseudocode for Dijkstra Search algoithm is:

```
dijkstra(GeographicPoint start,
            GeographicPoint goal, Consumer<GeographicPoint> nodeSearched))
    Initialize: Priority queue (PQ), visited HashSet, parent HashMap, and distances to infinity
    Enqueue {S, 0} into PQ
    while PQ is not empty:
        dequeue node curr from front of queue
        if (curr is not visited)
        add curr to visited set
        If curr == goal return parent map
        for each of curr's neighbors, n, not in visited set:
            if path through curr to n is shorter
                update curr as n's parent in parent map
                enqueue {n, distance} into the PQ
   reaching this line implies there is no path
The pseudocde for A^* Search algorithm is:
aStarSearch(GeographicPoint start,
            GeographicPoint goal, Consumer<GeographicPoint> nodeSearched)
    Initialize: Priority queue (PQ), visited HashSet, parent HashMap, and distances to infinity
    Enqueue {S, 0} into PQ
    while PQ is not empty:
        dequeue node curr from front of queue
        if (curr is not visited)
        add curr to visited set
        If curr == goal return parent map
        for each of curr's neighbors, n, not in visited set:
            if (path through curr to n + the geographic distance to goal) is shorter
                update curr as n's parent in parent map
```

enqueue {n, distance} into the PQ

reaching this line implies there is no path

The heuristic for decision-based reduction of total distance traveled while traversing a selected cycle of GPs uses  $A^*$  Search and Two-Opt Swap.  $A^*$  Search is used to determine shortest distance between any adjacent pair GPs.  $A^*$  Search is selected relative to Dijkstra Search to reduce the number of nodes searched. In  $A^*$  search, the distance used for setting priority underestimates actual travel distance. Therefore, a separate method is used for returning traversal distance of the routing path returned by  $A^*$  search. Finally, Two-Opt Swapping algorithm is implemented for selecting a subset of permutations of the routing circuit. Finally, the routing circuit with smallest distance traveled is returned to the console.

The pseudocode for Two-Opt is [3]:

```
implementTwoOptSwap(List<GeographicPoint>, i, k)
{
    1. take List[1] to List[i-1] and add them in order to new_route
    2. take List[i] to List[k] and add them in reverse order to new_route
    3. take List[k+1] to end and add them in order to new_route
    return new_route;
}
```

### Class: MapGraph

BFS is implemented in the class MapGraph.java, for which some skeleton code is provided. Modifications made to MapGraph include:

- MapGraph() is modified to an empty contructor that instantiates a HashMap for the ADT of this Java application. The HashMap object stores a GP as a key with a list of mapVertex() objects for its value. Definition of mapVertex() is deferred.
- **getNumVertices()**: **int** is modified to return the number of vertices contained within an instantiated MapGraph(). The return value is used for debug and test.
- getVertices(): Set < GeographicPoint > is modified to return the key set of the ADT HashMap. Membership in the key set is used as a conditional in BFS.
- **getNumEdges()**: **int** is modified to return the number of edges that connect each GP. The return value is used for debug and test.
- addVertex(GeographicPoint): boolean is modified to determine whether a proposed GP satisfies a specification and, if true, then calls the method implementAddVertex().
- implementAddVertex(GeographicPoint): void is a new method that adds the GP to the MapGraph/HashMap key set. This method calls mapVertex(); description deferred.
- addEdge(GeographicPoint, GeographicPoint, String, String, double): void is modified to determine whether a proposed edge satisfies specification and, if true, then calls the method implementAddVertex().
- implementAddEdge(GeographicPoint, GeographicPoint, String, String, double): void is a **new method** that adds the edge to the MapGraph/HashMap. This method calls setters/getters in mapEdge().
- bfs(GeographicPoint, GeographicPoint): List<GeographicPoint> is unmodified. This method is used for testing BFS in the console.
- bfs(GeographicPoint, GeographicPoint, Consumer<GeographicPoint>): List<GeographicPoint> is modified to implement BFS. The method validates whether the provided GP's are valid and, if true, then returns a list of GP's in reverse order that connect the start and destination GP's.
- buildRouteList(HashMap<GeographicPoint, GeographicPoint>, GeographicPoint, GeographicPoint): List<GeographicPoint> is a new method that returns a route in travel-order from start GP to destination GP and is called on successful completion of either BFS, Dijkstra, or aStarSearch algorithms.
- dijkstra(GeographicPoint, GeographicPoint): List<GeographicPoint> is unmodified. This method is used for testing Dikstra search in the console.

- dijkstra(GeographicPoint, GeographicPoint, Consumer < GeographicPoint >): List < GeographicPoint > is modified to implement the Dijkstra search algorithm. The method validates whether the the provided GP's are valid and, if true, then returns a list of GP's in reverse order that connect the start and destination GP's weighted for shortest distance.
- aStarSearch(GeographicPoint, GeographicPoint): List<GeographicPoint> is unmodified. This method is used for testing a\* search in the console.
- aStarSearch(GeographicPoint, GeographicPoint, Consumer<GeographicPoint>): List<GeographicPoint> is modified to implement the aStarSearch algorithm. The method validates whether the the provided GP's are valid and, if true, then returns a list of GP's in reverse order that connect the start and destination GP's weighted for shortest distance while eliminating nodes that unreasonable increase distance.
- printMapGraph(MapGraph): void is a new overloaded method that prints out the Map-Graph()/HashMap() ADT for debug and test.
- printMapGraph(HashMap<GeographicPoint, GeographicPoint>): void is a new overloaded method that prints out the reverse order list of GP's that were visited during BFS.
- printMapGraph(List route): void is a new overloaded method that prints out GPs that are contained in a list.
- main(String[]): void is a method modified to test operations of MapGraph.java class within the console.
- greedyCycle(List): List is a method for returning the shortest past between adjacent pairs of GPs in a list.
- distanceCycleRoute(List): double is a method that returns the total traversed distance (by edge) for a path input as a list.
- twoOptSwap(List): List is a method that determines the size of the swappable subset of a cycle of GPs.
- implementTwoOptSwap(List, int, int): List is a method that returns a path GPs as specified by the Two-Opt algorithm.

#### Class name: mapVertex

The class mapVertex represents a GP as a node. The mapVertex node also contains a list of mapEdge()'s that represent roads that connect a GP to other GP's in the MapGraph(). Data are private, so getter/setter methods are used to pass data to and from a mapVertex() instance. Figure 2 lists the setter/getter methods.

- mapVertex(GeographicPoint): mapVertex constructs the node object of the graph.
- setLocation(GeographicPoint): void is a setter for the GP location of mapVertex.
- getLocation(): GeographicPoint is a getter that returns the GP location of mapVertex.
- setMapEdge(): void is a setter for generating an empty array list of edges for mapVertex.
- setMapEdge(mapEdge): void is a setter for adding an edge to an array list of edges associated with mapVertex.
- getMapEdge(): List is a getter that returns the array list of edges for mapVertex.
- setStartRoute(GeographicPoint): void is a setter for the global start location for a search algorithm that uses mapVertex.
- getStartRoute(): GeographicPoint is a getter that returns the global start location for a search algorithm that uses mapVertex..
- setDistanceEdgeCumFromStart(): double.POSITIVE\_INFINITY is a setter for the initial priority of mapVertex for weighted search algorithms.
- setDistanceEdgeCumFromStart(double): double is a setter for updated priority of mapVertex for weighted search algorithms.
- **getDistanceEdgeCumFromStart()** : **double** is a getter that returns the distance of mapVertex from the global start by traversing map edges.
- setDistanceGeoFromStart(): double is a setter for the geographic distance of mapVertex from the global start location.

- **getDistanceGeoFromStart()**: **double** is a getter for the geographic distance of mapVertex from the global start location.
- compareTo(Object): int is a method that establishes a comaparison of priorities of the nodes that are in priority queues.

## Class name: mapEdge

The class mapEdge is a graph edge that represents roads connecting GP's. The graph is a di-Graph; therefore, an instance of mapEdge() contains a start node and an end node. The mapEdge object also contains other geographic data: street name, distance between the start and end GP's, and type of road. Data are private, so getter/setter methods pass data to and from a mapEdge() instance. Figure 2 lists the setter/getter methods.

- mapEdge(GeographicPoint, GeographicPoint, String, String, double): mapEdge constructs the mapEdge object.
- setStart(GeographicPoint): void is a setter for the start GP of an edge.
- **getStart()**: **GeographicPoint** is a getter for the start GP of an edge.
- setEnd(GeographicPoint): void is a setter for the end GP of an edge.
- getEnd(): GeographicPoint is a getter for the end GP of an edge.
- setStreetname(String): void is a setter for the street name of an edge.
- getStreetname(): String is a getter for the street name of an edge.
- setRoadType(String): void is a setter for the category of a street for an edge.
- getoadType(): String is a getter for the category of a street for an edge.
- setDistance(double): void is a setter for the length (km) edge.
- **getDistance()**: **double** is a getter for the length (km) an edge.
- toString(): String is a method that formats information of mapEdge for printing in string format.

#### Class Design: Overall Design Justification

The class design for the ADT leverages the classes mapVertex.java, and mapEdge.java to contruct node objects and edge objects. These objects are loaded as values into the HashMap of mapGraph.java. Whenever possible, variables and methods are defined as private. This provides an abstraction layer between user and data. The BFS method also is comprised of two methods—bfs() and buildRouteList(). The bfs() executes BFS that returns an intermediary list of routing nodes. The buildRouteList() transforms the intermediary list of routing nodes to a final list of nodes of the route in travel-order. Modularity provides robustness and flexibility. For example, the addition of Dijkstra Search and  $A^*$  Search algorithms requires only the addition of the methods specified by the pseudocode shown in the **Methods** section. The ADT and route publishing by buildRouteList() is unaffected by implementing additional search algorithms.

#### Results

Figure 3 shows the BFS deliverable—a route between two geographic locations traversing the fewest number of vertices. A video clip demonstrates execution of the project. The clip shows a route between start and destionation GP's and provides a visualization of GP's visited during BFS. The video clip also includes a cartoon of BFS generated using a visualization tool made available by Xueqiao (Joe) Xu. The cartoon is drawn representing the Google map of intersections featured in the video clip. The classes MapGraph.java, mapVertex.java, and mapEdge.java are available on request by contacting the corresponding author.

Figure 4 shows results of the heuristic decision-based determination of shortest route. Seven vertices were selected for testing and are shown in Figure 5. The decision-based heuristic tracks the shortest distance returned from the subset of route permutations. The final return is the shortest distance returned and its associated route.

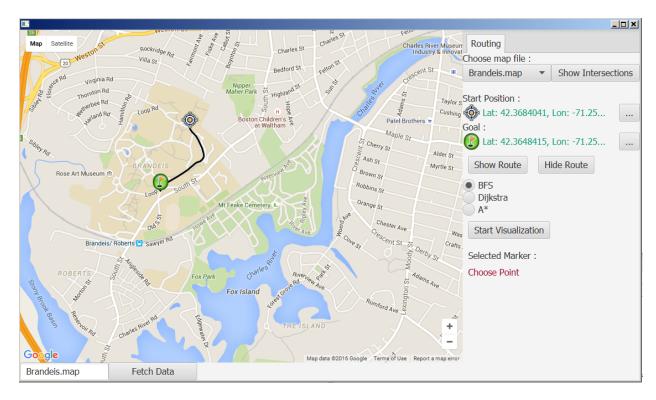


Figure 3: This figure shows a route generated using BFS between geographic locations on the campus of Brandeis University (Waltham, MA).

## Conclusions

Class design, an ADT, BFS, Dijkstra Search, and  $A^*$  Search were successfully implemented and demonstrated as a Java application that provides routing between two geographic locations using the Google Maps API. The implemented class design provides flexibility, modularity, and robustness. For example, different search algorithms can be implemented with the existing ADT with only modest changes to the **roadgraph** package. Finally, demonstration of a decision-based heuristic for determing the routing with the shortest distance from a subset of permutations is successful. The decision-based heuristic implemented  $A^*$  Search and Two-Opt Swap with results returned to the console.

## Acknowledgements

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## References

- 1. Java Documentation
- 2. Stack Overflow
- 3. Two-Opt

```
<terminated > MapGraph [Java Application] D:\Program Files\Java\jdk1.8.0_60\bin\javaw.exe (Feb 14, 2016, 9:19:25 PM)
The best distance is from an earlier routing, which is total distance [km] = 1523.6
        The distance from this run of TwoOpt Swap is [km] = 1588.8
The best distance is from an earlier routing, which is total distance [km] = 1523.6
        The distance from this run of TwoOpt Swap is [km] = 1923.7
The best distance is from an earlier routing, which is total distance [km] = 1523.6
        The distance from this run of TwoOpt Swap is [km] = 1979.2
The best distance is from an earlier routing, which is total distance [km] = 1523.6
        The distance from this run of TwoOpt Swap is [km] = 1924.1
Lat: 4.0, Lon: 1.0
Lat: 7.0, Lon: 3.0
Lat: 7.0, Lon: 3.0
Lat: 8.0, Lon: -1.0
Lat: 8.0, Lon: -1.0
Lat: 6.5, Lon: 0.0
Lat: 6.5, Lon: 0.0
Lat: 5.0, Lon: 1.0
Lat: 5.0, Lon: 1.0
Lat: 4.0, Lon: 0.0
Lat: 4.0, Lon: 0.0
```

Figure 4: This figure shows a screenshot of results returned to console from a decision-based heuristic route selection. The method tracks the shortest distance returned and compares it to distances returned from a subset of route permutations. The best distance and the best route are reported.

Lat: 4.0, Lon: 1.0

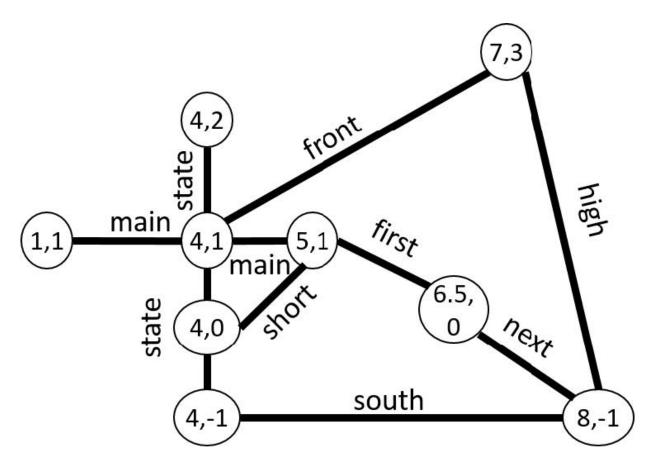


Figure 5: This figure shows a simple graph (map) provided by UCSD. Results reported in this work used the routing circuit  $(4, 1) \Rightarrow (7, 3) \Rightarrow (8, -1) \Rightarrow (4, -1) \Rightarrow (4, 0) \Rightarrow (5, 1) \Rightarrow (4, 1)$ .