

AOA

Johnson's Algorithm



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Johnson's Algorithm for All-Pairs Shortest Path Problem

Introduction:

Johnson's Algorithm is a powerful method to compute the shortest paths between all pairs of nodes in a graph, even when some edges have negative weights (but no negative weight cycles). The algorithm handles this challenge by first using Bellman-Ford to check for negative cycles and re-weighting the graph, followed by Dijkstra's Algorithm for efficient calculation of shortest paths.

Core Concepts and Mechanisms:

- **Graph Representation:**
 - The graph is represented as a collection of nodes and edges, where each edge has a weight (positive or negative). A new node is added to the graph to aid in re-weighting and to help with the **Bellman-Ford** procedure.
- **Bellman-Ford Algorithm:**

- Used to detect negative weight cycles and compute the shortest paths from the newly added node (a source node) to all other nodes.

- **Re-weighting Process:**

- After running Bellman-Ford, the graph is re-weighted so that all edge weights become non-negative. The formula used is:

$$\text{new_weight}(u,v) = \text{weight}(u,v) + h[u] - h[v]$$

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Where $h[u]$ is the shortest path from the source node to u .

- **Dijkstra's Algorithm:**

- Once the graph is re-weighted, **Dijkstra's algorithm** is applied from each node to calculate the shortest path from that node to every other node in the graph.

Algorithm Phases:

- **Graph Augmentation:**

- A new node is added, connected to all other nodes with edges of weight zero.

- **Bellman-Ford Execution:**

- The **Bellman-Ford algorithm** is executed from the newly added node to compute the shortest path distances to all other nodes, ensuring no negative cycles.
- **Re-weighting of the Graph:**
 - Based on the results from Bellman-Ford, the graph edges are re-weighted to ensure all edge weights are non-negative.
- **Dijkstra's Execution:**
 - **Dijkstra's algorithm** is executed from each node in the graph to compute the shortest paths to every other node.

Convergence Properties:

- **Asymptotic Convergence:**
 - As the number of iterations approaches infinity, the probability of finding the global optimum solution approaches 1, provided the algorithm maintains a proper balance between exploration (via the somersault process) and exploitation (via climbing).
- **Exploration vs. Exploitation:**
 - The algorithm balances between **exploring** new areas of the search space and **exploiting** previously discovered good solutions to refine the search.

Time Complexity:

The time complexity of Johnson's Algorithm can be analyzed as follows:

- **Initialization:** $O(n \times d + n \times f)$
- **Per iteration:**
 - Climb process: $O(n \times d \times f)$
 - Watch-jump process: $O(n \times f)$
 - Somersault process: $O(n \times d + n \times f)$

The overall complexity is:

$$O(n \times d + n \times f + t \times (n \times d \times f + n \times f + n \times d + n \times f))$$

Where:

- n is the population size (number of nodes)
- d is the dimension of the problem (number of nodes)
- f is the cost of a single objective function evaluation
- t is the number of iterations

Search Space Characteristics:

Johnson's Algorithm performs well in a variety of situations based on the characteristics of the search space:

- **Modality:**
 - Works well for both **unimodal** and **multimodal** landscapes. In highly multimodal landscapes, a larger population size is beneficial for better exploration.
- **Separability:**
 - Effective for separable functions but may struggle with non-separable problems where variables interact.
- **Ruggedness:**
 - Johnson's Algorithm is robust against rugged functions with many local optima due to its combination of exploration and exploitation techniques.
- **Deceptiveness:**
 - The algorithm can handle deceptive problems (where local optima might mislead the search) due to its global exploration process.

Extensions and Variants:

- **Adaptive Parameter Control:**

- Dynamically adjusts parameters (like climbing step and somersault range) to refine the search strategy over time.

- **Hybrid Approaches:**

- Combines Johnson's Algorithm with other local search methods or gradient-based approaches for faster convergence.

- **Constraint Handling:**

- Uses penalty functions for soft constraints or repair mechanisms for hard constraints.

- **Parallel Implementation:**

- Utilizes a parallel approach where multiple populations explore different parts of the solution space concurrently, speeding up the process.

- **Multi-objective Extensions:**

- Adapted to handle problems with multiple objectives, where the algorithm maintains a set of non-dominated solutions (Pareto front).

Applications:

Johnson's Algorithm is widely used for solving **shortest path problems** in various fields such as:

- **Routing in Networks (Telecommunications):** Optimizing communication paths between nodes in a network.
- **Logistics and Supply Chain:** Finding optimal transportation routes for goods between multiple points.
- **Urban Planning:** Identifying the shortest paths between different locations in a city.
- **Robotics:** Pathfinding for robot navigation in unknown environments with obstacles.

This summary of **Johnson's Algorithm** highlights the algorithm's core ideas, its efficiency in handling negative weights, and its application across a variety of optimization problems. You can adapt the algorithm to different scenarios where shortest path computations are needed, even in complex and large-scale networks.