Metaheuristic's Project Report - Taboo Search

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Introduction

Taboo Search is a metaheuristic optimization algorithm designed to solve combinatorial and nonlinear problems. It enhances the performance of local search methods by using memory structures that describe the visited solutions or user-defined rules. The algorithm avoids cycling back to previously explored solutions by maintaining a "taboo list," which temporarily forbids or penalizes moves that would reverse recent changes. This approach enables the search to escape local optima and explore a broader solution space, making Taboo Search effective for complex optimization tasks such as scheduling, routing, and resource allocation.

In this project, the implementation of the Taboo Search algorithm is tailored to address a specific optimization problem. The code is structured to initialize a candidate solution, iteratively explore its neighborhood, and update the solution based on objective function evaluations. A taboo list is maintained to prevent revisiting recently explored solutions, thereby encouraging the search to escape local optima. The algorithm continues this process for a predefined number of iterations or until a satisfactory solution is found.

The project is organized into modular components, separating the core Taboo Search logic from problem-specific details such as solution representation and neighborhood generation. This modularity allows for easy adaptation to different optimization problems. The results demonstrate the effectiveness of Taboo Search in finding high-quality solutions within reasonable computational time, highlighting its practical applicability to real-world combinatorial optimization challenges.

The target problem is Quadratic Assignment Problem (QAP).

Installation and execution

To install and run the Taboo Search code, follow these steps:

Prerequisites

Python 3.7 or higher

Required packages: pandas

Install dependencies using pip:

pip install pandas

Running the Code

Navigate to the project directory and run the script using:

```
python main.py [-f DATA_FILE] [-t TENURE] [-i ITERATIONS] [-r RUNS] [-s SEED]
[test_all]
```

Arguments

- test_all (optional): If specified, runs all tests. The configurations for all tests are in config.json.
- -f, --file: Path to the data file (default: tai12a.dat).
- -t, --tenure: Tenure for the Taboo search (default: 5).
- -i, --iterations: Number of iterations (default: 1000).
- -r, --runs: Number of runs (default: 10).
- -s, --seed: Random seed (default: 0).

Example

```
python main.py -f tai17a.dat -t 7 -i 2000 -r 5 -s 42
```

This command runs the Taboo Search on data/tai17a.dat with a tenure of 7, for 2000 iterations, 5 runs, and a random seed of 42.

To run all tests, simply run:

```
python main.py test_all
```

Results and Analysis

Configurations

Various test configurations are provided in configs.json. Each configuration is different based on

```
{
    Neighboring function = {1 (SWAP), 2(REVERSE), 3(SWAP-REVERSE)},
    Use of Frequencies = {True, False},
    Number of iterations = {1000, 4000},
    Tenure value = {5, 10}
}
```

As a result, there are 24 test cases generated for this experiment. It is also to be noted that for the Neighboring function = 3 (SWAP-REVERSE), the selection of the function for neighbor function is 80% for SWAP and 20% for REVERSE technique.

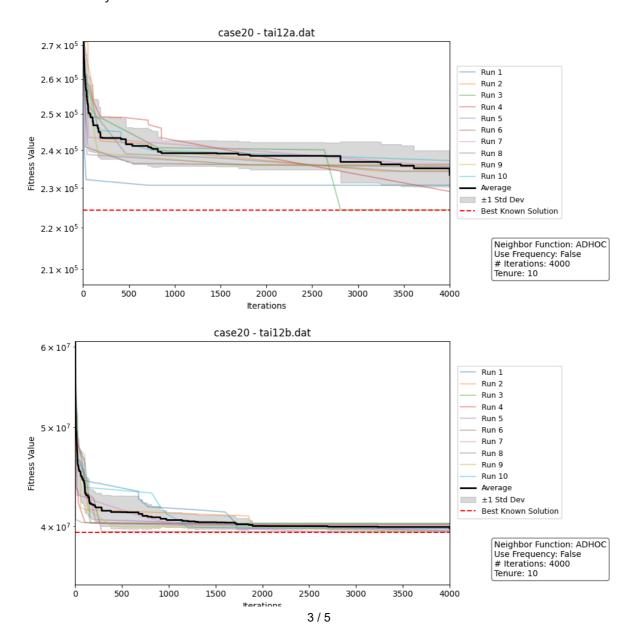
Generating Results

After executing the tests using main.py, the results are automatically saved in two files: best_improvements.json and results.md. These files contain detailed information about the performance and outcomes of the Taboo Search runs.

To analyze these results and generate visualizations, use the illustrate_and_analysis.py module. Simply run the following command in your terminal:

```
python illustrate_and_analysis.py
```

This script will process the stored results and perform all remaining analysis tasks, providing insights and summaries based on the test outcomes. Executes a series of tests and stores the results in the files best_improvements.json and results.md. These files contain the outcomes of the test executions and can be used for further analysis.



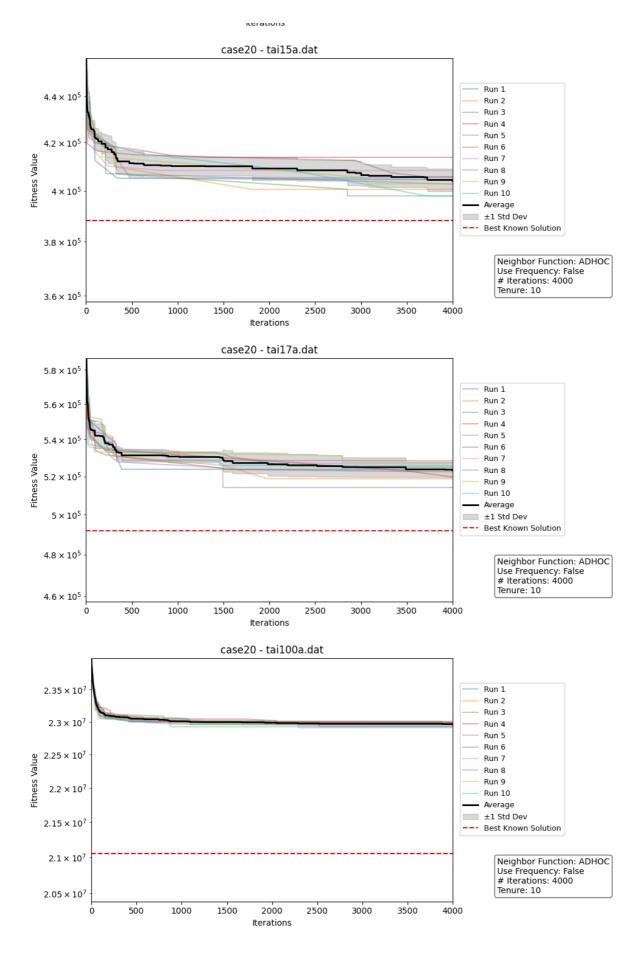


Figure 1: Results for Case 20

Results evaluation

All the results are stored in results/ directory. The runs are compared based on the best fitness found.

• The final fitness value is better with more number of iterations, hence there are some runs with 1000 iterations which find the optimal solution.

- There is a noticeable difference between the runs which use REVERSE as the neighboring function, compared to the other two.
- Based on the rankings, there isn't much of a difference between the performance of SWAP and SWAP-REVERSE neighboring functions.
- The change in the Tenure did not show any difference for the results, yet, it is not concluded that it is irrelevant.
- The use of Frequencies is not shown to be effective drastically in this experiment.

Future work and further enhancements

Here are some future works and possible enhancements on this work:

- Provide time measurements for a better evaluation of the performances of different runs.
- Provide more neighboring functions, and a mixture of them. Also, the probabilities should be put in the configurations file.
- More Tenure values to check their effect on the runs.
- Provide better configurations to check effectiveness of Frequencies.

Conclusion

This experiment shows the performance of **Taboo Search** on the given QAP.