



Lab AI: The Cambio Problem

2018-2019

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Content

- **Data Structures**
 - Request, Zone & Car objects
 - Solution object
 - Overlap Matrix
- **Algorithm**
 - Greedy Assign
 - Local Moves
 - Metaheuristic
- **Results**
 - Performance
 - Search space
 - Possible improvements



Request, Zone & Car objects

- Parsed from input once
- Immutable objects for Request & Zone
- Car is a string
- Request & Zone stored as
 - Immutable list
 - id→object maps



Solution class

- Car→Zone & Request→Car maps
- Only object copied for each local move
 - Input data is not copied
 - If local move was not successful no new copy



Overlap Matrix

- Pre-calculates overlapping requests
 - Calculated only once
- Stored in 2D boolean matrix
- Used in local moves
- Allows for faster feasibility check



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Greedy Assign

- Loop over unassigned requests
 - 1) Find suitable car assigned to zone
 - 2) Find suitable car assigned to neighbor
 - 3) Assign a new car to zone
 - 4) Leave unassigned
- Used for initial solution
- Guaranties a feasible solution
- Called after each local move

Local Moves

- Moves
 - 1) Move request from 'optimal' zone to neighbor
 - 2) Move request from neighbor to 'optimal' zone
 - 3) Swap car assigned to request with another car
 - 4) Unassign 1 car from all its requests [†]
 - 5) Unassign 1 request [†]
- All guarantee a feasible solution

[†]: Twice as likely to be picked

Metaheuristic

- Simulated annealing
 - 1) Random initial solution
 - 2) Generate new solution with random local move
 - 3) Solution accepted
 - if cost is lower; or
 - with ever decreasing random probability
 - 4) Go back to 2 unless stop condition reached
- "Ideal" parameters found after a lot of testing[†]

†: See results on cambio.dries007.net/sa_parameter_tests



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Results

- Results generated with 300 seconds on 2 threads.
- Median of a number of runs
- Impressive, or so we think 😊

Input File	Toledo	Our Score	Improvement
100_5_14_25	10015	8795	12.18%
100_5_19_25	6700	6045	9.78%
210_5_33_25	14325	11180	21.95%
210_5_44_25	5890	4045	31.32%
360_5_71_25	12955	7490	42.18%

Performance

- Performance is key!
 - Python generators
 - Limiting copying to absolute minimum
 - Profiling of the algorithm
 - No feasibility check!
 - Not required
 - Overlap checking is still expensive, even with matrix.
- 12k; 10k; 5k Im/s for 100; 210; 360 requests
 - Complete simulated annealing takes ~10 seconds



Search space

- Greedy assign after every move
 - Limits search space
 - Example: No unassign two cars without attempting to assigning requests to them.
- Limited local moves
- No crossing "gaps of infeasibility"



Possible improvements

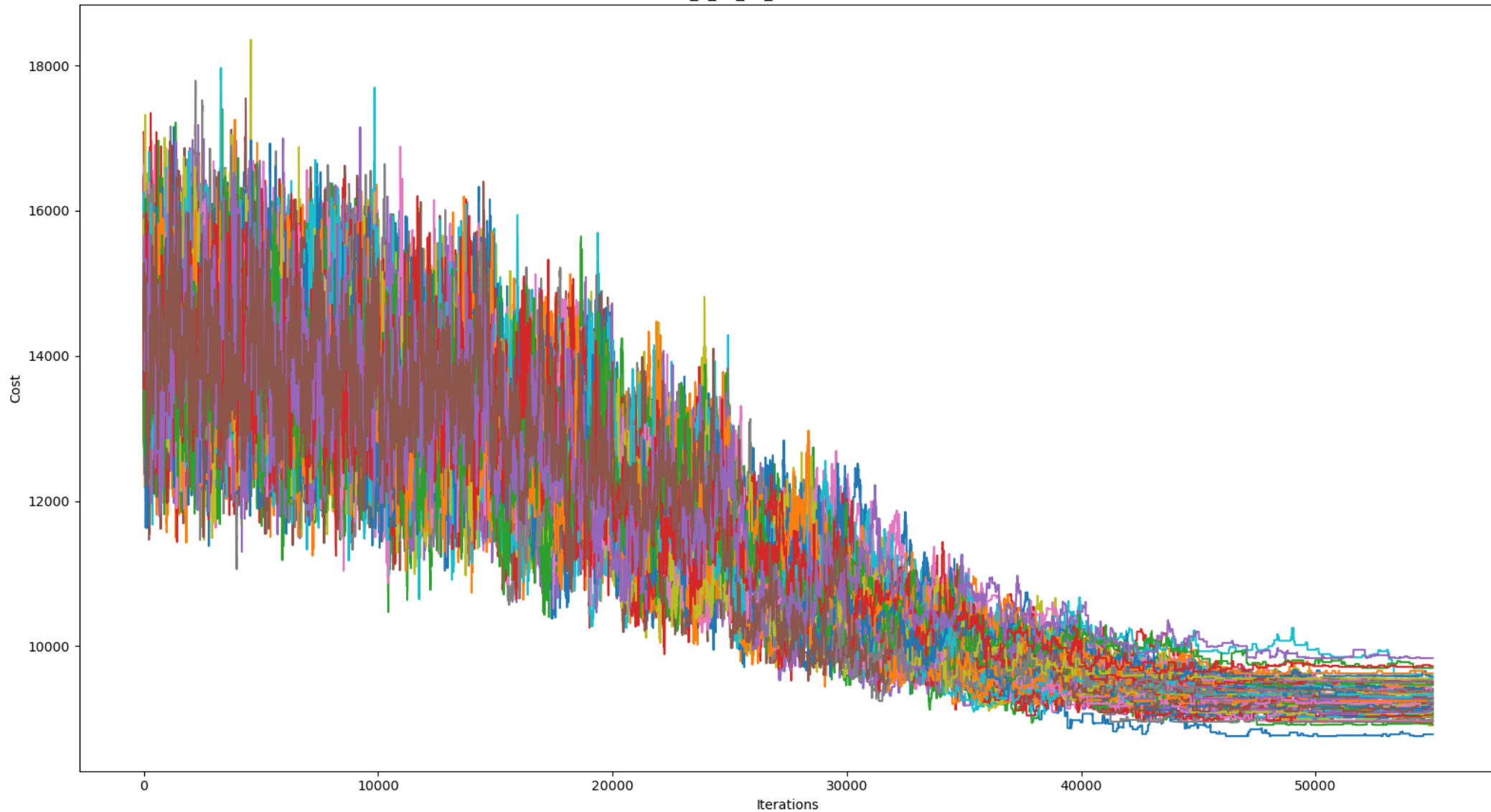
- Remove search space limitations
- Multipliers for local moves
 - Picked 2x on unassign moves with limited testing



Questions?

Example results for 100_5_14_25

100_5_14_25_sol.csv Best: 8785



Example results for 360_5_71_25

360_5_71_25_sol.csv Best: 7635

