

Maximum-minimum distance clustering method for split-delivery vehicle-routing problem: Case studies and performance comparisons

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ABSTRACT

The split-delivery vehicle-routing problem in which delivery to a demand point can be served by any number of vehicles is an important branch of classic VRP. Objective function is used to minimise travel distance while using the lowest number of vehicles. According to the maximum-minimum distance clustering method, a three-stage algorithm is proposed. First, the maximum-minimum distance method is employed to cluster customer points into the lowest number of groups. Second, according to the maximum vehicle capacity, the load demand in each group is adjusted to create suitable customer points in each clustering group by adopting 'push-out' and 'pull-in' operations. Third, a tabu search is used and an optimised route for each group is generated to minimise the total travel distance. Numerical experiments, some on the benchmark data set, are presented to verify the feasibility and effectiveness of the proposed algorithm. The computational results show that the performance of the proposed algorithm is better in terms of both optimised travel distance and less computation time when the problem size is less than 75. The results also show that when the customer points are in a cluster distribution around the depot, the algorithm achieves better performance.

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Metoda združevanja največjih in najmanjših razdalj za problem usmerjanja vozil z deljeno dostavo: Študije primerov in primerjave uspešnosti

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POVZETEK

Problem načrtovanja deljene dostave, pri katerem lahko dostavo do ciljnega mesta opravi poljubno število vozil, je pomembna veja problema usmerjanja vozil (VRP). Ciljna funkcija predvideva zmanjšanje skupne poti ob uporabi najmanjšega števila vozil. V skladu z metodo združevanja po načelu največja-najmanjša razdalja je predlagan tristopenjski algoritem. Najprej se za razvrščanje lokacij odjemalcev v najnižje število skupin uporabi metoda največja-najmanjša razdalja. Nato se, glede na največjo nosilnost vozila prilagodi povpraševanje tako, da se vsaki skupini dodelijo lokacije kupcev z uporabo operacij "push-out" in "pull-in". Nato se uporabi iskanje s tabuji s čimer se ustvari optimizirana pot za vsako skupino in se zmanjša skupna dolžina vseh poti. Za preverjanje izvedljivosti in učinkovitosti predlaganega algoritma so predstavljeni numerični poskusi, nekateri na podlagi referenčnih podatkov. Rezultati kažejo, da je, ko je velikost problema manjša od 75, učinkovitost predlaganega algoritma večja, tako glede na optimizirano razdaljo potovanja kot tudi na krajši čas računanja. Rezultati tudi kažejo, da algoritem doseže boljše delovanje, ko so lokacije kupcev združene okoli skladišča.

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PODATKI O ČLANKU

Ključne besede:

Problem deljene dostave;
Metoda največja-najmanjša razdalja;
Prilagoditev obremenitve in povpraševanja;
Optimizacija poti;
Iskanje s tabuji;
Združevanje najprej in usmerjanje kasneje

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