

A hybrid grey cuckoo search algorithm for job-shop scheduling problems under fuzzy conditions

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ABSTRACT

This paper aims to acquire the precise makespan or delivery period in job-shop scheduling (JSP) under fuzzy conditions. To this end, the author designed a grey scheduling model and a hybrid grey cuckoo search (HGCS) algorithm in the following steps. Firstly, three- and four-parameter interval grey numbers were introduced to depict the fuzzy makespan and delivery period, respectively; then, the possibility measure and necessity measure were defined, and the tardiness credibility index was proposed to estimate the probability of job tardiness. After that, a grey mixed integer programming model was developed to minimize the mean tardiness credibility, and the HGCS was proposed to solve the model. Finally, simulations were conducted on the classical example of $6(3) \times 6$. The results show that the proposed algorithm outperformed the basic cuckoo search. The research findings shed new light on the JSP under fuzzy conditions.

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Hibridni sivi algoritem kukavičjega iskanja za terminiranja proizvodnje po naročilu v nejasnih pogojih

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POVZETEK

Namen prispevka je pridobiti natančen čas izdelave ali čas dobave izdelka za problem terminiranja proizvodnje po naročilu v nejasnih pogojih. Za ta namen smo zasnovali siv model načrtovanja in hibridni algoritem kukavičjega iskanja (HGCS) v naslednjih korakih. Najprej so bile vpeljane tri- in štiriparametrične sive intervalne številke, ki predstavljajo mehki čas izdelave in mehki čas dobave izdelka. Nato sta bila opredeljena možnost ukrepanja ter nujnost ukrepanja, predlagan pa je bil tudi indeks verodostojnosti za oceno verjetnosti izvedbe proizvodnega procesa. Nadalje je bil razvit siv mešani celoštevilski programski model. Za zmanjšanje povprečne verjetnosti neizvedbe proizvodnega procesa je bil uporabljen HGCS algoritem. Nato so bile izvedene simulacije na klasičnem $6(3) \times 6$ primeru. Rezultati kažejo, da je predlagani algoritem presegel sposobnosti osnovnega algoritma kukavičjega iskanja. Ugotovitve raziskave prikazujejo problem terminiranja proizvodnje po naročilu v nejasnih pogojih v novi luči.

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PODATKI O ČLANKU

Ključne besede:

Problem terminiranja proizvodnje po naročilu (JSP);
Sivo terminiranje;
Nejasni pogoji;
Kukavičje iskanje (CS);
Verodostojnost;
Merilo možnosti;
Merilo nujnosti

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