

# HARMONY SEARCH HYPER-HEURISTIC WITH DIFFERENT PITCH ADJUSTMENT OPERATOR FOR SCHEDULING PROBLEMS

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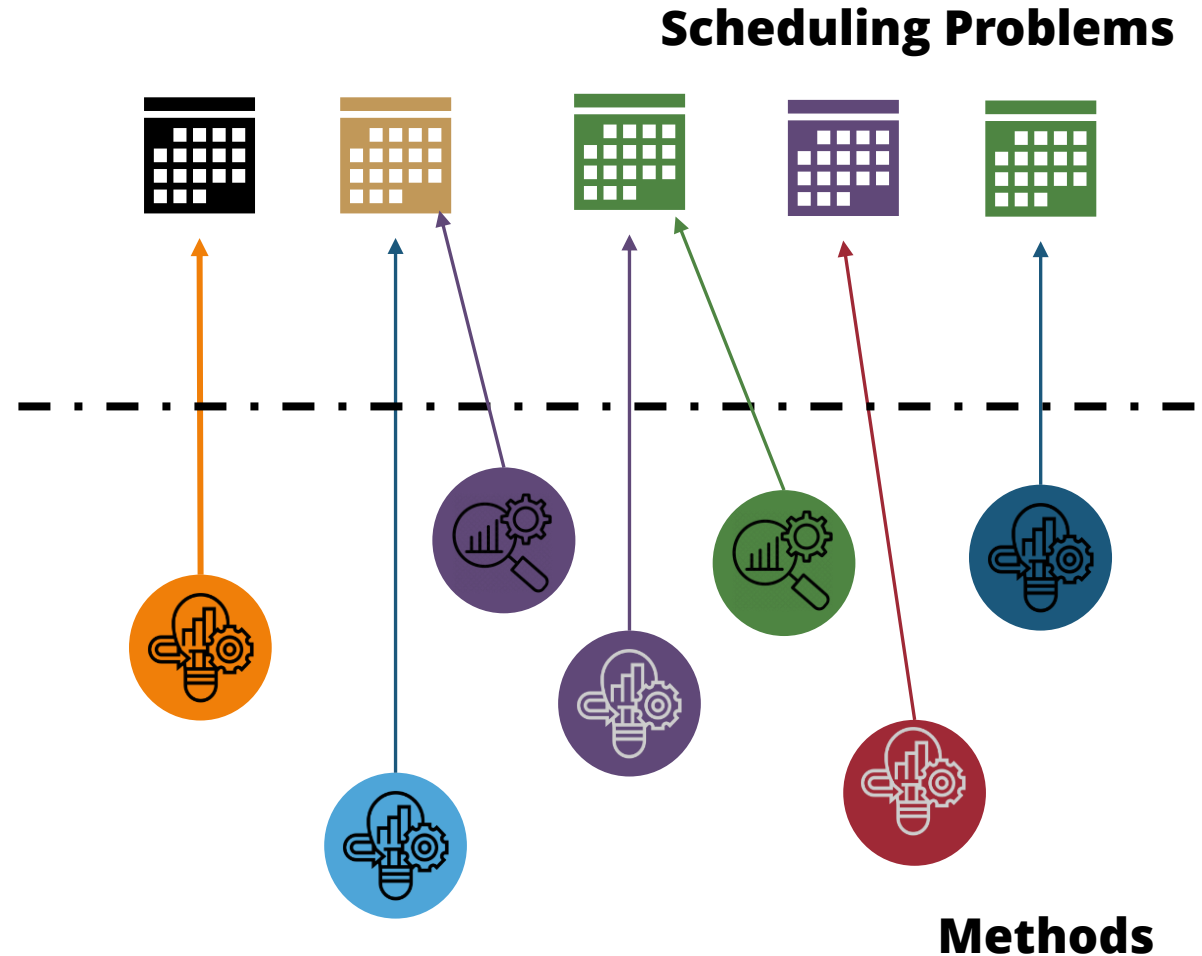


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# Introduction

**Scheduling problems occur in almost all fields or domains related to services especially in health, transportation and educational institutions.**



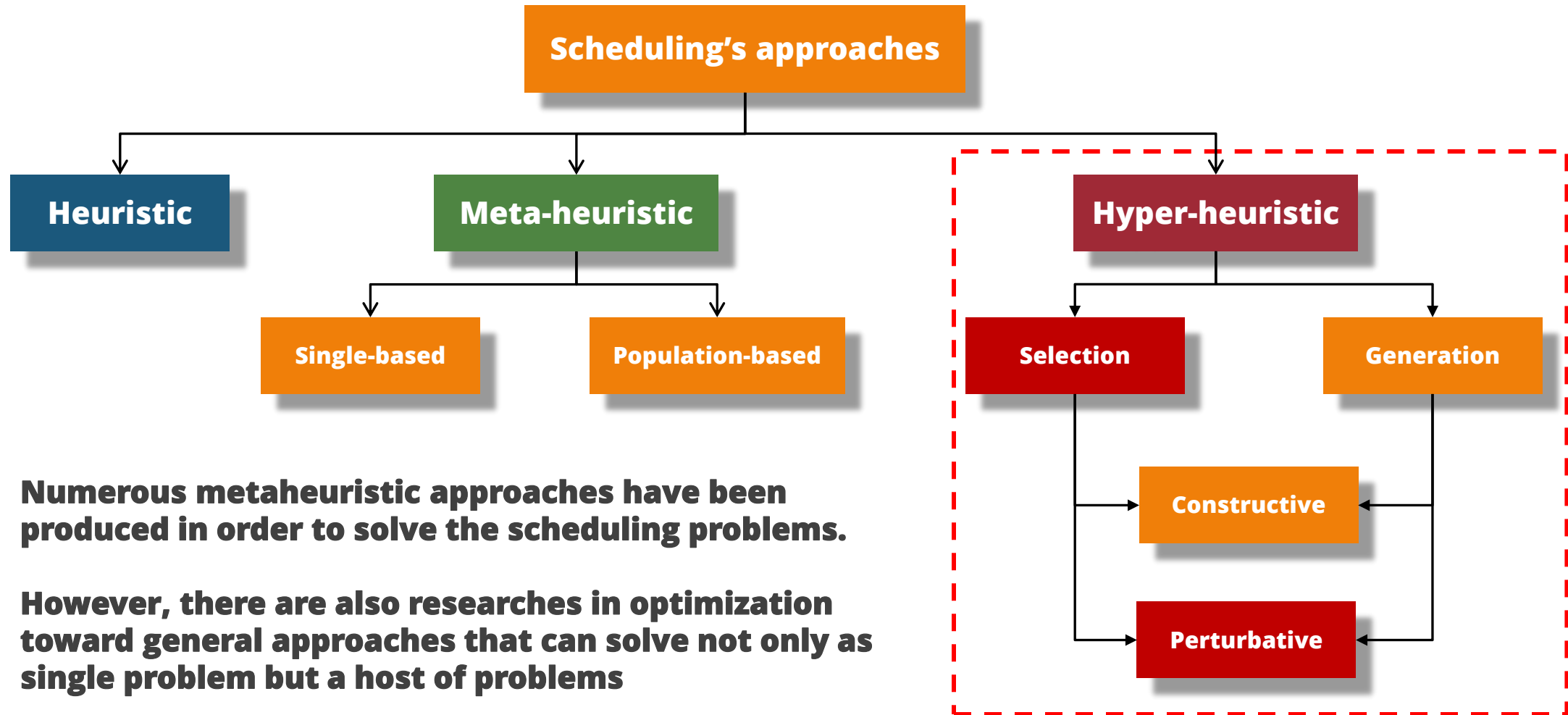
# Objectives



**To produce a  
general method  
that able solve  
various  
scheduling  
problems**

**HYPER-HEURISTIC**

# Literature Review

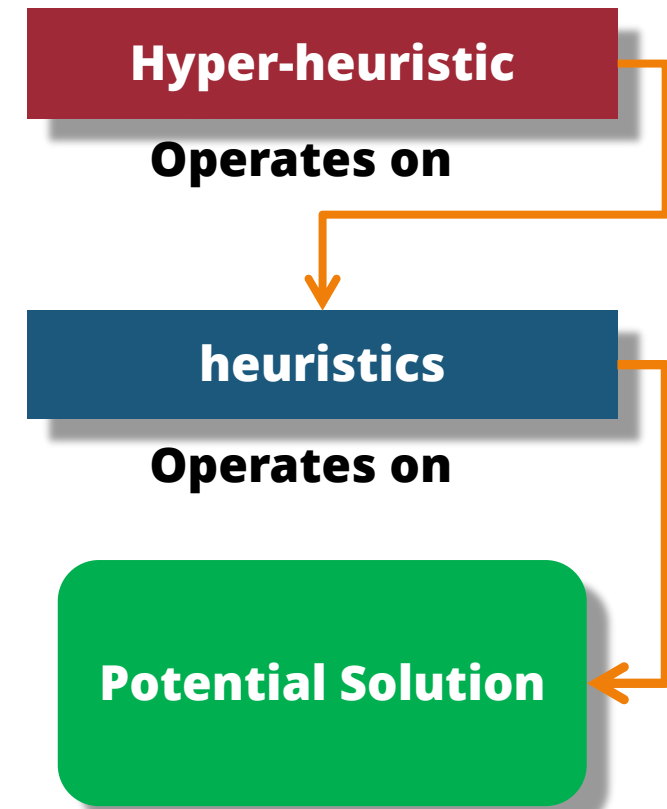


# Hyper-heuristic

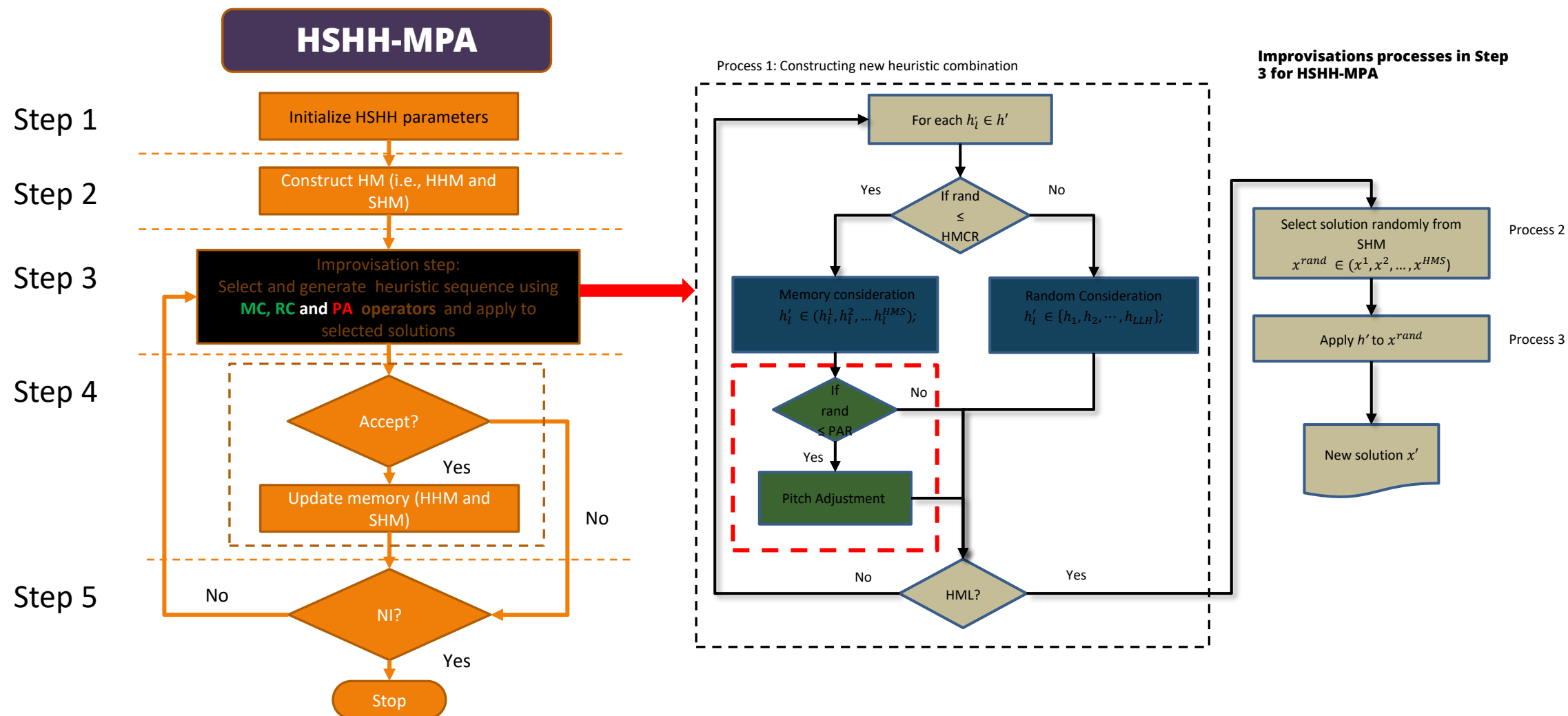
Originally define as ***"heuristics to choose heuristics"***.

New definition - ***"search method or learning mechanism for selecting or generating heuristics to solve computational search problem"***  
(Burke et al.,2009).

HH different with meta-heuristics which HH operates on the search space of heuristics rather than directly on the search space of solution



# HSHH with Modified Pitch Adjustment (HSHH-MPA)





# HSHH with Modified Pitch Adjustment (HSHH-MPA)

## Three different heuristic selection in pitch adjustment

### First selection (*PAType1*)

- Simple adjustment which the new index of  $h'_i$  will be added/ subtracted by 1.

### Second selection (*PAType2*)

- The new index of  $h'_i$  will be selected from the best heuristic sequence in the HHM.

### Third selection (*PAType3*)

- The new index of  $h'_i$  will be selected based on the lowest heuristic's usage in the HHM





# Experimental and results

**Three scheduling problem were used to test the proposed method.**

- 1. Un-capacitated examination timetabling problem (Carter's)
- 2. Nurse rostering problem (INRC2010)

**Constraints – typically divided into two types:**

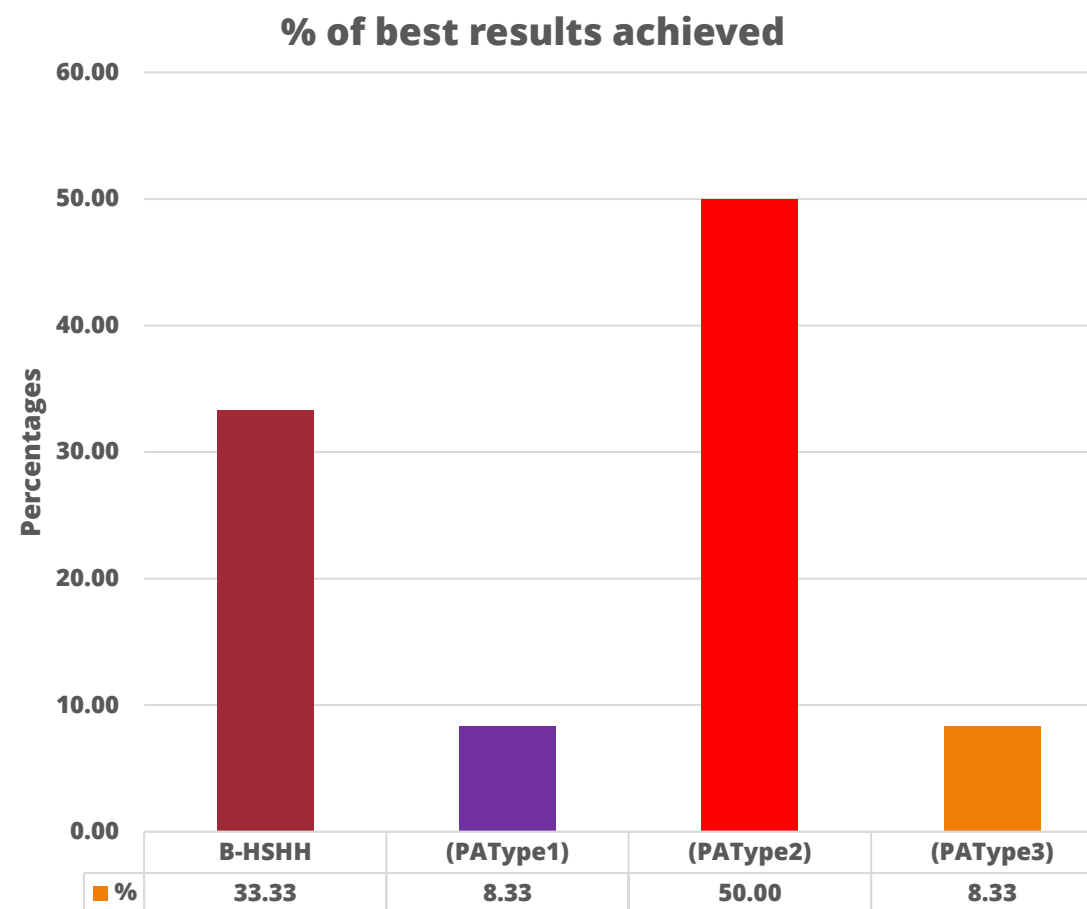
- Hard constraints – must be satisfied.
- Soft constraints – are desired but not absolutely necessary.

**The objective is to satisfied all the hard constraint and minimize the penalty value of the soft constraint violation in order to produce a quality timetable.**

# Experimental and results

## Comparative results of the proposed methods with B-HSHH for Carter dataset

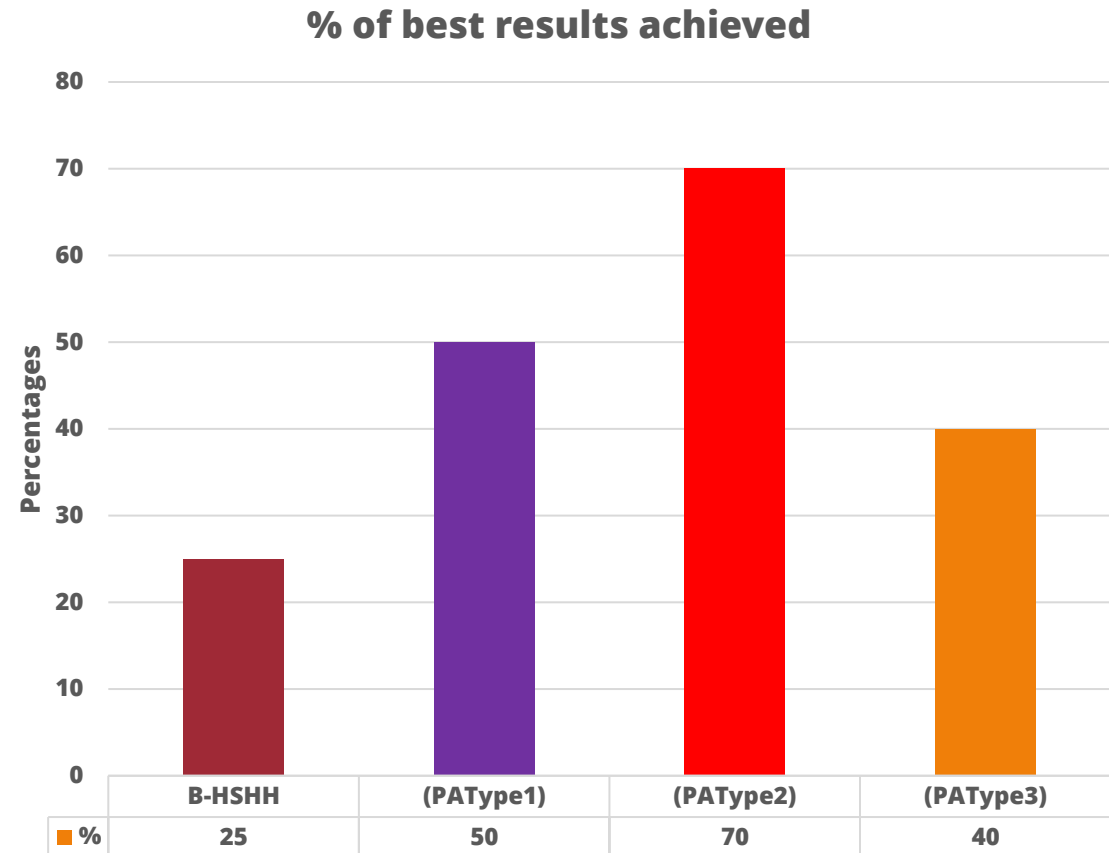
Instance	B-HSHH	(PAType1)	(PAType2)	(PAType3)
CAR-S-91-1	6.09	6.13	<b>6</b>	6.04
CAR-F-92-1	<b>4.88</b>	4.92	<b>4.88</b>	4.97
EAR-F-83-1	38.71	<b>37.22</b>	38.22	37.26
HEC-S-92-1	11.16	10.75	<b>10.74</b>	11.05
KFU-S-93	<b>14.71</b>	14.82	14.78	14.87
LSE-F-91	<b>11.97</b>	12.37	12.02	12.09
RYE-S-93	10	10.04	<b>9.83</b>	9.84
STA-F-83-1	<b>157.31</b>	157.38	157.4	157.32
TRE-S-92	9.25	9.1	9.2	9.05
UTA-S-92-1	3.84	3.82	<b>3.76</b>	3.82
UTE-S-92	27.07	26.89	<b>26.58</b>	27.14
YOR-F-83	39.53	38.92	<b>38.9</b>	39.85



# Experimental and results

## Comparative results of the proposed methods with B-HSHH for INRC2010 dataset

Instance	B-HSHH	(PAType1)	(PAType2)	(PAType3)
<i>sprint early01</i>	58	<b>57</b>	<b>57</b>	58
<i>sprint early02</i>	60	<b>59</b>	<b>59</b>	60
<i>sprint early03</i>	53	53	<b>52</b>	53
<i>sprint early04</i>	62	62	<b>61</b>	<b>61</b>
<i>sprint early05</i>	<b>58</b>	59	59	<b>58</b>
<i>sprint early06</i>	<b>55</b>	<b>55</b>	<b>55</b>	<b>55</b>
<i>sprint early07</i>	<b>58</b>	<b>58</b>	<b>58</b>	<b>58</b>
<i>sprint early08</i>	<b>56</b>	57	<b>56</b>	57
<i>sprint early09</i>	57	57	<b>56</b>	57
<i>sprint early10</i>	54	54	<b>53</b>	<b>53</b>
<hr/>				
<i>medium early01</i>	<b>249</b>	251	250	<b>249</b>
<i>medium early02</i>	251	<b>250</b>	<b>250</b>	251
<i>medium early03</i>	247	<b>246</b>	<b>246</b>	249
<i>medium early04</i>	248	247	<b>246</b>	248
<i>medium early05</i>	315	<b>312</b>	313	314
<hr/>				
<i>long early01</i>	214	213	214	<b>212</b>
<i>long early02</i>	245	242	<b>241</b>	243
<i>long early03</i>	248	<b>245</b>	246	<b>245</b>
<i>long early04</i>	317	<b>316</b>	<b>316</b>	317
<i>long early05</i>	298	<b>292</b>	295	296





# Conclusions

**In this study, the Harmony search-based hyper-heuristic with pitch adjustment operator (i.e., HSHHMPA) is presented with three types of heuristic selection mechanism (PAType1, PAType2, and PAType3).**

**The purpose of applying the pitch adjustment operator is to insert a different way of heuristic selection (e.g., using learning mechanism) instead of randomness in the memory consideration operator.**

**Apparently, by combining the HSHH with pitch adjustment operators (HSHH-MPA), it was slightly better compared to the original HSHH approach (B-HSHH) in most of problem instances in both datasets (Carter and INRC2010).**

**Based on the experimental performances, HSHH-MPA with PAType2 appeared to be the best selection mechanism. The computational results indicated that selecting the heuristic from best heuristics vector inside HHM, had led the algorithm to select the most appropriate heuristics. Thus, using the most appropriate heuristic at the right time could lead to better results.**

**The focus of this study is the selection mechanism for choosing low-level heuristics. It can be in the best interest of future work in the same field, to test the effectiveness of different ways of solution selection from solution harmony memory (SHM) and different move acceptance criteria with other methods.**

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