

Multi-objective sequence dependent setup times flowshop scheduling: a new algorithm and a comprehensive study

Online materials

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Chapter 1

Pseudo Codes

```
1 UBCalculate; // Computation of the upper bounds for each objective;
2 W1 = 0.0;
3 W2 = 1.0;
   // 10 iterations;
4 while (W1 ≤ 0.9) do
5   InitialAntsGeneration(Ant1,Ant2); // Two initial solution are generated;
6   AddSolutionToFront(Ant1,Ant2); // the solutions are added to the non
   dominated archive;
7   LocalSearches(Ant1,Ant2); // a sequence of local searches is applied on
   the ants;
8   AddSolutionToFront(Ant1,Ant2);
9   BestAnt = FindBestAnt(Ant1,Ant2); // the best Ant is calculated
   according to the weighted objective function;
10  PheromoneMatrixInitialization;
11  PairWiseJobInterchange;
12  Num_Iter = 0;
   // Internal loop: 16 iterations;
13  while (Num_Iter < 16) do
14    PheromoneMatrixUpdating;
15    AntsGeneration(Ant1,Ant2);
16    AddSolutionToFront(Ant1,Ant2);
17    LocalSearches(Ant1,Ant2);
18    AddSolutionToFront(Ant1,Ant2);
19    BestAnt = FindBestAnt(Ant1,Ant2);
20    PairWiseJobInterchange;
21    Num_Iter = Num_Iter + 1;
22  end
23  W1 = W1 + 0.1;
24  W2 = W2 - 0.1;
25 end
```

Algorithm 1: MOACA algorithm

```

1 UBCalculate; // Computation of the upper bounds for each objective;
2 W1 = 0.0;
3 W2 = 1.0;
   // 10 iterations;
4 while (W1 ≤ 0.9) do
5   InitialAntsGeneration(Ant1,Ant2); // Two initial solution are generated;
6   AddSolutionToFront(Ant1,Ant2); // the solutions are added to the non
   dominated archive;
7   LocalSearches(Ant1,Ant2); // a sequence of local searches is applied on
   the ants;
8   AddSolutionToFront(Ant1,Ant2);
9   BestAnt = FindBestAnt(Ant1,Ant2); // the best Ant is calculated
   according to the weighted objective function;
10  PheromoneMatrixInitialization;
11  PairWiseJobInterchange;
12  Time = now();
   // Internal loop: To each iterations has been allotted one tenth of
   the total computation time;
13  while ( (now() - Time) <  $\frac{TotalTimeAllowed}{10}$  ) do
14    PheromoneMatrixUpdating;
15    AntsGeneration(Ant1,Ant2);
16    AddSolutionToFront(Ant1,Ant2);
17    LocalSearches(Ant1,Ant2);
18    AddSolutionToFront(Ant1,Ant2);
19    BestAnt = FindBestAnt(Ant1,Ant2);
20    PairWiseJobInterchange;
21  end
22  W1 = W1 + 0.1;
23  W2 = W2 - 0.1;
24 end

```

Algorithm 2: MOACA modified algorithm


```

1 Generation of initial solutions; // STEP 1;
2 K := 0; ;
3 repeat // 2 times
4   K = K + 1 ;
   // STEP 2.1;
5   if K = 1 then S = SIni1;
6   else S = SIni2;
7   repeat // 4 times
8     T = 575; // STEP 3.1: Initialize the temperature;
9     repeat
10      for n ← 1 to 30 do
11        Choose the objective to optimize; // STEP 3.2.1;
12        // STEP 3.2.2;
13        S' := RIPS(S);
14        UpdateArchive;
15        Compute Δ;
16        if Δ < 0 then S' = S ;
17        else
18          Sample an uniform random number U;
19          Exp = exp  $\frac{-\Delta}{T}$ ;
20          if U ≤ Exp then S' = S ;
21        end
22        T := T * 0.9; // STEP 3.3;
23      until (T ≤ 20);
24      // STEP 4;
25      if K = 1 then
26        X2 = X2 - 0.1666, X1 = 1 - X2;
27        if X2 ≥ 0.5 then S = SIni1
28      else
29        X1 := X1 - 0.1666, X2 := 1 - X1;
30        if X1 ≥ 0.5 then S = SIni2
31      until ((K = 1) and (X2 < 0.5) or (K = 2) and (X1 < 0.5));
32 until K = 2;
33 PairWiseJobInterchange; // STEP 5;

```

Algorithm 3: MOSA_Varad original algorithm

```

1 Generation of initial solutions; // STEP 1;
2 K := 0; ;
3 repeat // 2 times
4   K = K + 1 ;
   // STEP 2.1;
5   if K = 1 then S = SIni1;
6   else S = SIni2;
7   repeat // 4 times
8     T = 575; // STEP 3.1: Initialize the temperature;
9     Time = now();
10    while (now() - Time) <  $\frac{TotalTimeAllowed}{8}$  do
11      for n ← 1 to 30 do
12        Choose the objective to optimize; // STEP 3.2.1;
13        // STEP 3.2.2;
14        S' := RIPS(S);
15        UpdateArchive;
16        Compute Δ;
17        if Δ < 0 then S' = S ;
18        else
19          Sample an uniform random number U;
20          Exp =  $\exp \frac{-\Delta}{T}$ ;
21          if U ≤ Exp then S' = S ;
22        end
23        T := T * 0.9; // STEP 3.3;
24      end
25      // STEP 4;
26      if K = 1 then
27        X2 = X2 - 0.1666, X1 = 1 - X2;
28        if X2 ≥ 0.5 then S = SIni1
29      else
30        X1 := X1 - 0.1666, X2 := 1 - X1;
31        if X1 ≥ 0.5 then S = SIni2
32      until ((K = 1) and (X2 < 0.5) or (K = 2) and (X1 < 0.5));
33 until K = 2;
34 PairWiseJobInterchange; // STEP 5;

```

Algorithm 4: MOSA_Varad_M algorithm

Chapter 2

Tables

2.1 Tables of mean values

| SSD50 | Time | 150 | | | 200 | | | |
|-------|-----------------------|-------|-------------------|--------------|-----------------------|-------|-------------------|--------------|
| # | Method | I_H | I_ε^1 | $Eval(10^3)$ | Method | I_H | I_ε^1 | $Eval(10^3)$ |
| 1 | RIPG | 1.296 | 1.067 | 2.548.679 | RIPG | 1.313 | 1.057 | 3.423.776 |
| 2 | MOSA_Varad_M | 1.272 | 1.102 | 3.587.690 | MOSA_Varad_M | 1.282 | 1.096 | 4.772.831 |
| 3 | MOSA_Varad | 1.232 | 1.127 | 1.339.338 | MOSA_Varad | 1.232 | 1.127 | 1.339.338 |
| 4 | MOIGS | 1.186 | 1.164 | 2.023.348 | MOIGS | 1.202 | 1.150 | 2.510.204 |
| 5 | MOGALS_Arroyo | 1.179 | 1.132 | 920.041 | MOGALS_Arroyo | 1.189 | 1.127 | 1.148.871 |
| 6 | MOTS | 1.151 | 1.136 | 685.987 | MOTS | 1.163 | 1.130 | 798.745 |
| 7 | PESAIH | 1.106 | 1.201 | 583.685 | PESAIH | 1.123 | 1.189 | 757.140 |
| 8 | PESA | 1.104 | 1.202 | 552.473 | PESA | 1.121 | 1.191 | 712.579 |
| 9 | MOACA17_M | 1.087 | 1.189 | 2.201.857 | MOACA17_M | 1.095 | 1.185 | 2.751.410 |
| 10 | MOACA18_M | 1.087 | 1.188 | 2.208.651 | MOACA18_M | 1.095 | 1.185 | 2.750.188 |
| 11 | MOACA19_M | 1.083 | 1.192 | 2.211.429 | MOACA19_M | 1.091 | 1.187 | 2.750.047 |
| 12 | MOACA20_M | 1.082 | 1.191 | 2.211.536 | MOACA20_M | 1.091 | 1.187 | 2.748.924 |
| 13 | PGA_ALS | 1.024 | 1.250 | 617.776 | PGA_ALS | 1.034 | 1.246 | 798.703 |
| 14 | MOGA_Murata | 0.980 | 1.276 | 1.366.304 | MOGA_Murata | 1.004 | 1.263 | 1.826.234 |
| 15 | ε -NSGAIH | 0.969 | 1.266 | 1.215.814 | ε -NSGAIH | 0.989 | 1.255 | 1.629.181 |
| 16 | CMOGA | 0.897 | 1.332 | 1.155.755 | CMOGA | 0.930 | 1.313 | 1.537.986 |
| 17 | hMGA | 0.804 | 1.356 | 498.624 | hMGA | 0.815 | 1.348 | 667.361 |
| 18 | PILS | 0.741 | 1.441 | 426.402 | PILS | 0.791 | 1.401 | 565.870 |

Table 2.1: Results for the $C_{max} - TWT$ criteria and SSD50. Average quality indicator values for the 18 algorithms tested under the two different termination criteria. Instance group where setup times length is 50% that of the processing times. For each termination criteria level, the methods are sorted according to I_H .

| SSD125 # | Time Method | 150 | | | Method | 200 | | |
|-------------|----------------------|-------|-------------------|--------------|----------------------|-------|-------------------|--------------|
| | | I_H | I_ε^1 | $Eval(10^3)$ | | I_H | I_ε^1 | $Eval(10^3)$ |
| 1 | RIPG | 1.318 | 1.064 | 2.762.511 | RIPG | 1.336 | 1.054 | 3.615.022 |
| 2 | MOSA_Varad_M | 1.237 | 1.146 | 3.623.574 | MOSA_Varad_M | 1.248 | 1.140 | 4.713.809 |
| 3 | MOIGS | 1.225 | 1.147 | 2.698.486 | MOIGS | 1.241 | 1.134 | 3.392.280 |
| 4 | MOSA_Varad | 1.182 | 1.178 | 1.338.261 | MOSA_Varad | 1.182 | 1.178 | 1.338.261 |
| 5 | MOGALS_Arroyo | 1.154 | 1.157 | 912.086 | MOGALS_Arroyo | 1.163 | 1.153 | 1.150.823 |
| 6 | MOTS | 1.126 | 1.162 | 627.080 | MOTS | 1.135 | 1.158 | 732.265 |
| 7 | PESA | 1.075 | 1.216 | 710.123 | PESA | 1.092 | 1.205 | 908.765 |
| 8 | PESAI | 1.067 | 1.221 | 707.241 | PESAI | 1.086 | 1.208 | 907.282 |
| 9 | MOACA17_M | 1.060 | 1.228 | 2.206.634 | MOACA17_M | 1.065 | 1.226 | 2.686.160 |
| 10 | MOACA18_M | 1.059 | 1.227 | 2.205.608 | MOACA18_M | 1.065 | 1.225 | 2.684.479 |
| 11 | MOACA20_M | 1.056 | 1.231 | 2.203.806 | MOACA20_M | 1.063 | 1.227 | 2.685.790 |
| 12 | MOACA19_M | 1.056 | 1.232 | 2.202.398 | MOACA19_M | 1.062 | 1.228 | 2.686.138 |
| 13 | PGA_ALS | 0.955 | 1.323 | 656.617 | PGA_ALS | 0.967 | 1.318 | 834.233 |
| 14 | ε -NSGAI | 0.913 | 1.296 | 1.219.000 | MOGA_Murata | 0.934 | 1.297 | 1.822.611 |
| 15 | MOGA_Murata | 0.908 | 1.313 | 1.398.489 | ε -NSGAI | 0.934 | 1.284 | 1.593.860 |
| 16 | CMOGA | 0.810 | 1.380 | 1.167.108 | CMOGA | 0.843 | 1.360 | 1.522.397 |
| 17 | PILS | 0.729 | 1.448 | 448.360 | PILS | 0.774 | 1.410 | 581.475 |
| 18 | hMGA | 0.699 | 1.425 | 509.212 | hMGA | 0.709 | 1.417 | 665.950 |

Table 2.2: Results for the $C_{max} - TWT$ criteria and SSD125. Average quality indicator values for the 18 algorithms tested under the two different termination criteria. Instance group where setup times length is 125% that of the processing times. For each termination criteria level, the methods are sorted according to I_H .

| SSD50 # | Time Method | 150 | | | Method | 200 | | |
|------------|----------------------|-------|-------------------|--------------|----------------------|-------|-------------------|--------------|
| | | I_H | I_ε^1 | $Eval(10^3)$ | | I_H | I_ε^1 | $Eval(10^3)$ |
| 1 | RIPG | 1.314 | 1.062 | 2.886.704 | RIPG | 1.333 | 1.053 | 3.899.048 |
| 2 | MOSA_Varad_M | 1.217 | 1.138 | 3.190.094 | MOSA_Varad_M | 1.232 | 1.133 | 4.271.434 |
| 3 | MOIGS | 1.197 | 1.121 | 3.144.601 | MOIGS | 1.219 | 1.109 | 4.182.232 |
| 4 | MOSA_Varad | 1.151 | 1.170 | 1.337.774 | MOSA_Varad | 1.151 | 1.170 | 1.337.774 |
| 5 | MOGALS_Arroyo | 1.131 | 1.166 | 890.481 | MOGALS_Arroyo | 1.143 | 1.159 | 1.213.891 |
| 6 | MOTS | 1.093 | 1.188 | 528.608 | MOTS | 1.108 | 1.181 | 654.054 |
| 7 | PESA | 1.023 | 1.212 | 847.249 | PESA | 1.044 | 1.201 | 1.131.626 |
| 8 | PESAI | 1.002 | 1.222 | 811.593 | PESAI | 1.023 | 1.211 | 1.083.591 |
| 9 | MOACA18_M | 0.995 | 1.253 | 2.271.125 | MOACA18_M | 0.999 | 1.249 | 2.808.732 |
| 10 | MOACA17_M | 0.992 | 1.254 | 2.266.600 | MOACA17_M | 0.998 | 1.249 | 2.806.738 |
| 11 | MOACA20_M | 0.990 | 1.255 | 2.271.435 | MOACA20_M | 0.996 | 1.251 | 2.809.364 |
| 12 | MOACA19_M | 0.989 | 1.256 | 2.225.466 | MOACA19_M | 0.993 | 1.253 | 2.775.174 |
| 13 | PGA_ALS | 0.921 | 1.306 | 661.826 | PGA_ALS | 0.934 | 1.300 | 867.378 |
| 14 | MOGA_Murata | 0.821 | 1.336 | 1.434.468 | MOGA_Murata | 0.850 | 1.319 | 1.935.043 |
| 15 | ε -NSGAI | 0.799 | 1.345 | 1.231.011 | ε -NSGAI | 0.827 | 1.328 | 1.660.687 |
| 16 | CMOGA | 0.753 | 1.374 | 1.188.429 | CMOGA | 0.790 | 1.350 | 1.602.032 |
| 17 | PILS | 0.661 | 1.476 | 486.066 | PILS | 0.713 | 1.429 | 654.566 |
| 18 | hMGA | 0.585 | 1.505 | 512.607 | hMGA | 0.598 | 1.495 | 691.926 |

Table 2.3: Results for the $C_{max} - TFT$ criteria and SSD50. Average quality indicator values for the 18 algorithms tested under the two different termination criteria. Instance group where setup times length is 50% that of the processing times. For each termination criteria level, the methods are sorted according to I_H .

| SSD125 | | 150 | | | 200 | | | |
|--------|----------------------|-------|-------------------|--------------|----------------------|-------|-------------------|--------------|
| # | Time Method | I_H | I_ε^1 | $Eval(10^3)$ | Method | I_H | I_ε^1 | $Eval(10^3)$ |
| 1 | RIPG | 1.322 | 1.063 | 2.963.529 | RIPG | 1.339 | 1.055 | 3.913.874 |
| 2 | MOIGS | 1.196 | 1.124 | 3.490.327 | MOIGS | 1.218 | 1.114 | 4.607.469 |
| 3 | MOSA_Varad_M | 1.148 | 1.168 | 3.207.332 | MOSA_Varad_M | 1.166 | 1.161 | 4.231.502 |
| 4 | MOSA_Varad | 1.067 | 1.208 | 1.336.762 | MOSA_Varad | 1.067 | 1.208 | 1.336.762 |
| 5 | MOGALS_Arroyo | 1.043 | 1.210 | 893.042 | MOGALS_Arroyo | 1.056 | 1.203 | 1.192.328 |
| 6 | MOTS | 1.029 | 1.220 | 487.054 | MOTS | 1.041 | 1.213 | 603.787 |
| 7 | MOACA18_M | 0.946 | 1.280 | 2.269.013 | PESA | 0.961 | 1.248 | 1.242.884 |
| 8 | MOACA17_M | 0.943 | 1.281 | 2.266.877 | MOACA18_M | 0.952 | 1.277 | 2.805.182 |
| 9 | MOACA20_M | 0.941 | 1.283 | 2.269.028 | MOACA17_M | 0.950 | 1.277 | 2.803.932 |
| 10 | PESA | 0.940 | 1.259 | 945.584 | MOACA20_M | 0.948 | 1.279 | 2.803.418 |
| 11 | MOACA19_M | 0.937 | 1.284 | 2.224.286 | MOACA19_M | 0.945 | 1.281 | 2.784.915 |
| 12 | PESAI | 0.916 | 1.272 | 897.434 | PESAI | 0.937 | 1.261 | 1.183.023 |
| 13 | PGA_ALS | 0.835 | 1.349 | 681.036 | PGA_ALS | 0.847 | 1.342 | 877.647 |
| 14 | ε -NSGAI | 0.705 | 1.400 | 1.227.838 | MOGA_Murata | 0.731 | 1.385 | 1.910.583 |
| 15 | MOGA_Murata | 0.702 | 1.404 | 1.443.474 | ε -NSGAI | 0.729 | 1.385 | 1.627.731 |
| 16 | CMOGA | 0.626 | 1.450 | 1.191.594 | CMOGA | 0.663 | 1.426 | 1.581.127 |
| 17 | PILS | 0.607 | 1.508 | 508.728 | PILS | 0.650 | 1.467 | 673.374 |
| 18 | hMGA | 0.468 | 1.584 | 517.613 | hMGA | 0.479 | 1.575 | 687.022 |

Table 2.4: Results for the $C_{max} - TFT$ criteria and SSD125. Average quality indicator values for the 18 algorithms tested under the two different termination criteria. Instance group where setup times length is 125% that of the processing times. For each termination criteria level, the methods are sorted according to I_H .

Chapter 3

Figures

3.1 Figures

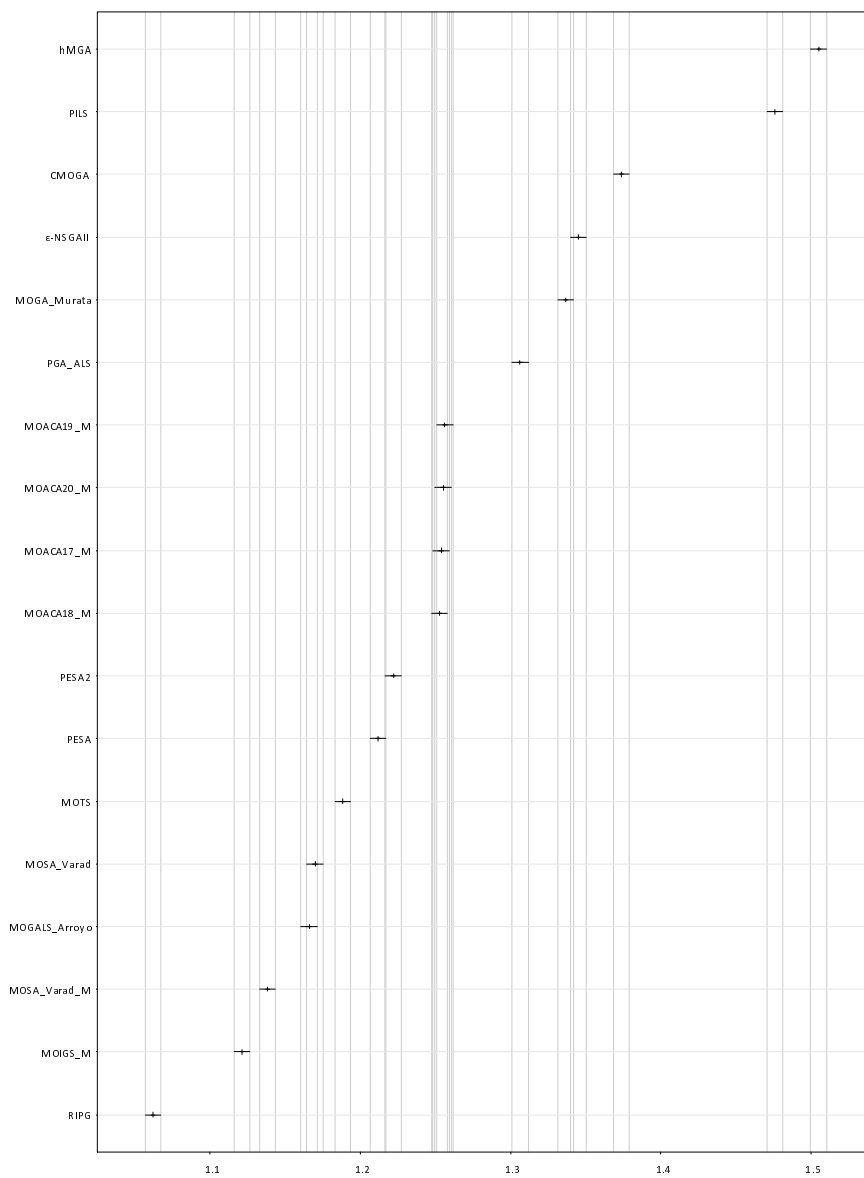


Figure 3.1: SSD50 instance set where setup times length is 50% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01$, $\alpha = 0.05$) for the algorithm factor in the ANOVA experiment. Epsilon indicator response variable and $t = 150ms$ CPU time stopping criterion. Makespan and total flowtime criteria.

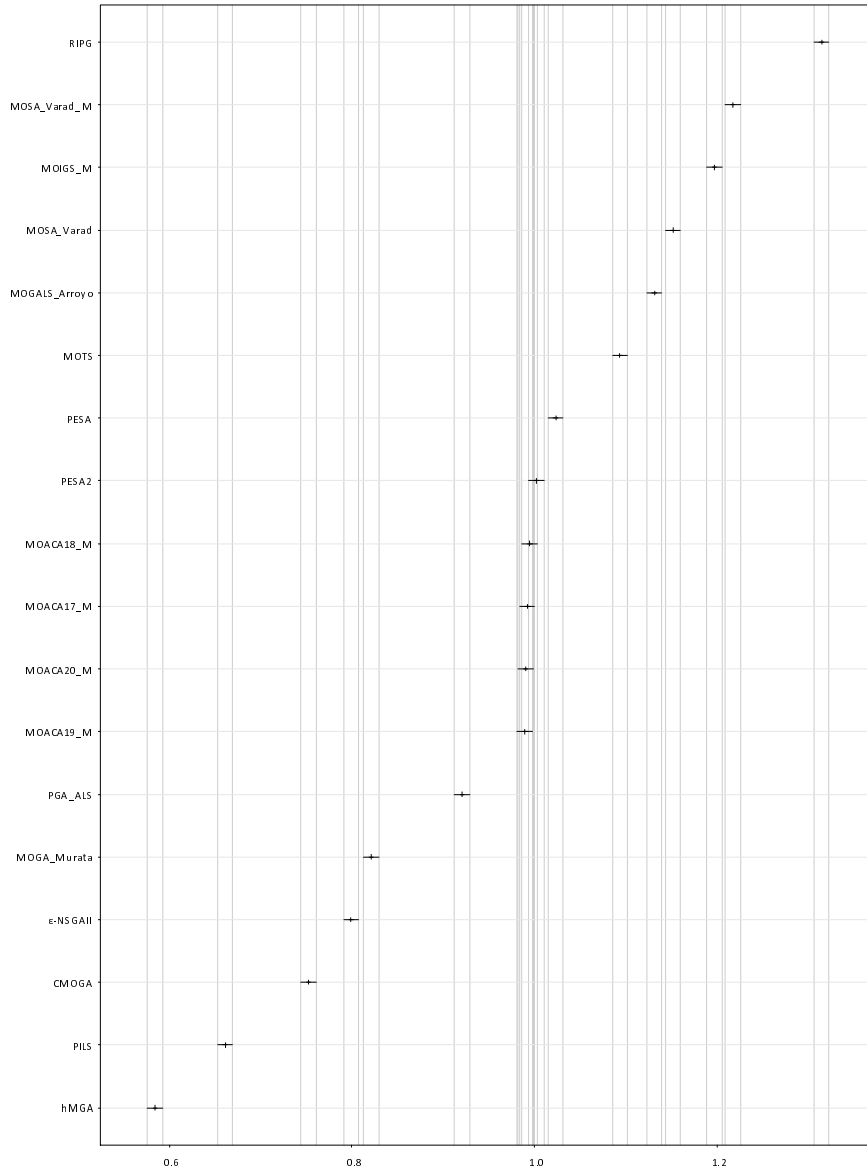


Figure 3.2: SSD50 instance set where setup times length is 50% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01$, $\alpha = 0.05$) for the algorithm factor in the ANOVA experiment. Hypervolume response variable and $t = 150ms$ CPU time stopping criterion. Makespan and total flowtime criteria.

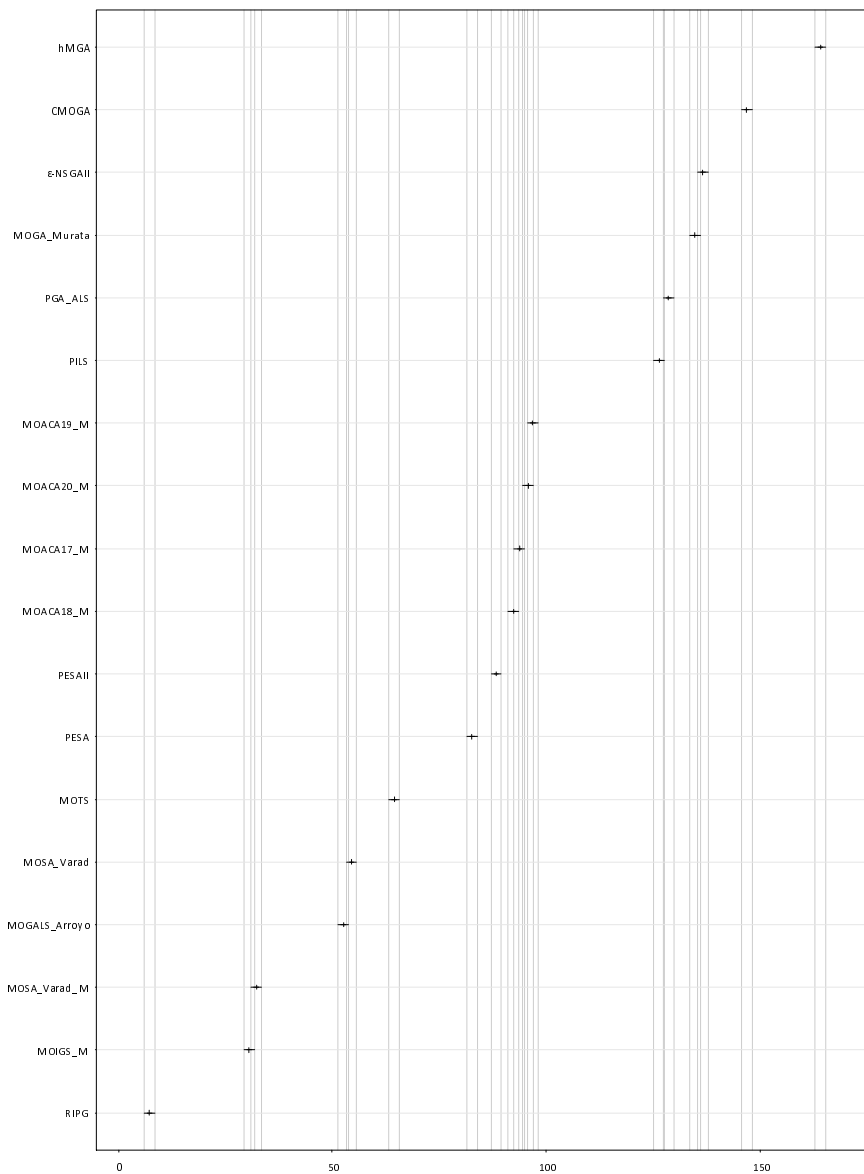


Figure 3.3: SSD50 instance set where setup times length is 50% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01$, $\alpha = 0.05$) for the algorithm factor in the Friedman rank-based experiment. Epsilon indicator response variable and $t = 150ms$ CPU time stopping criterion. Makespan and total flowtime criteria.

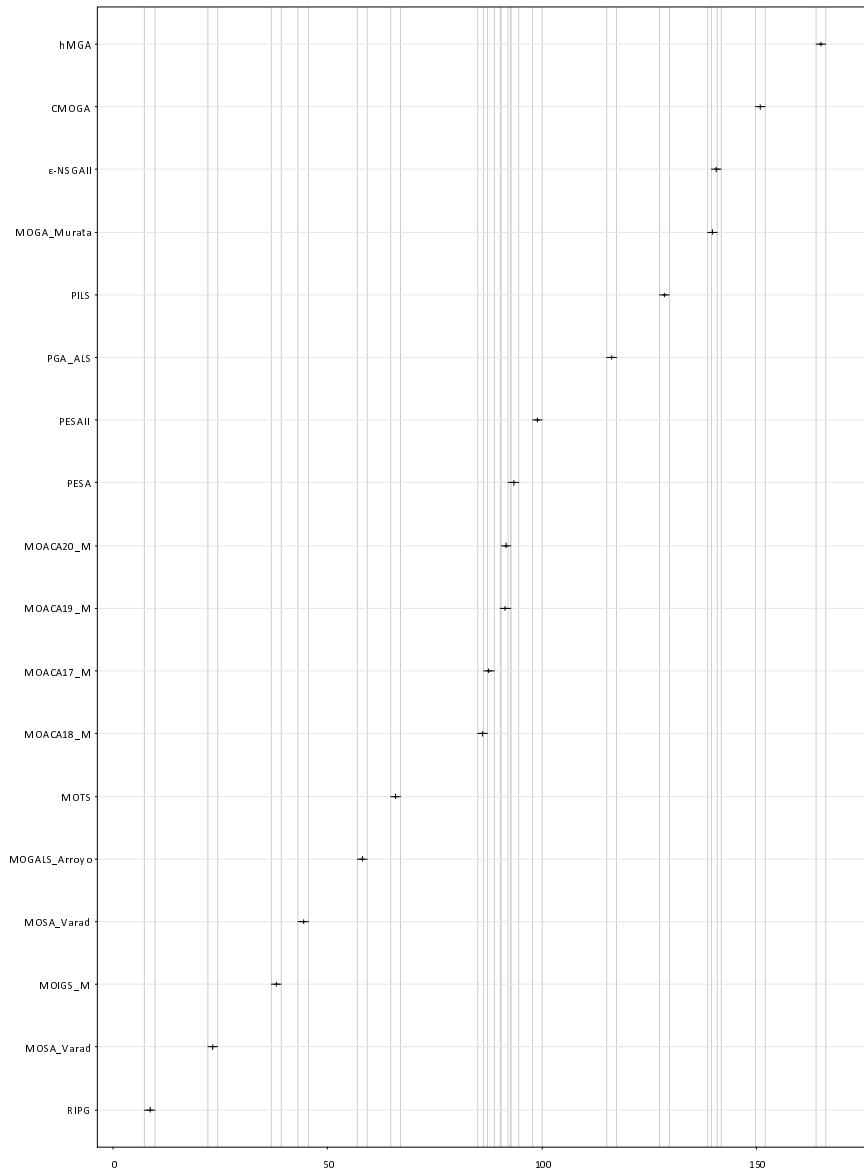


Figure 3.4: SSD50 instance set where setup times length is 50% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01$, $\alpha = 0.05$) for the algorithm factor in the in the Friedman rank-based experiment. Hypervolume response variable and $t = 150ms$ CPU time stopping criterion. Makespan and total flowtime criteria.

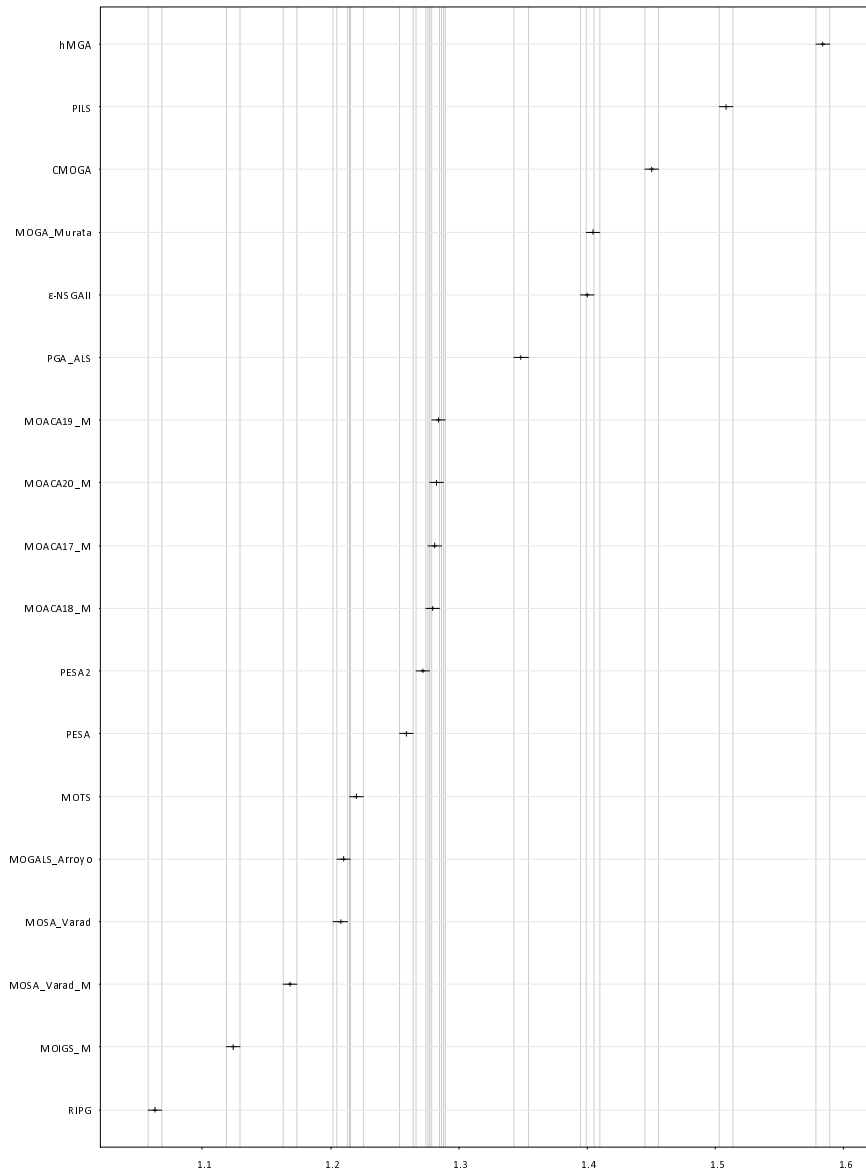


Figure 3.5: SSD125 instance set where setup times length is 125% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01$, $\alpha = 0.05$) for the algorithm factor in the ANOVA experiment. Epsilon indicator response variable and $t = 150ms$ CPU time stopping criterion. Makespan and total flowtime criteria.

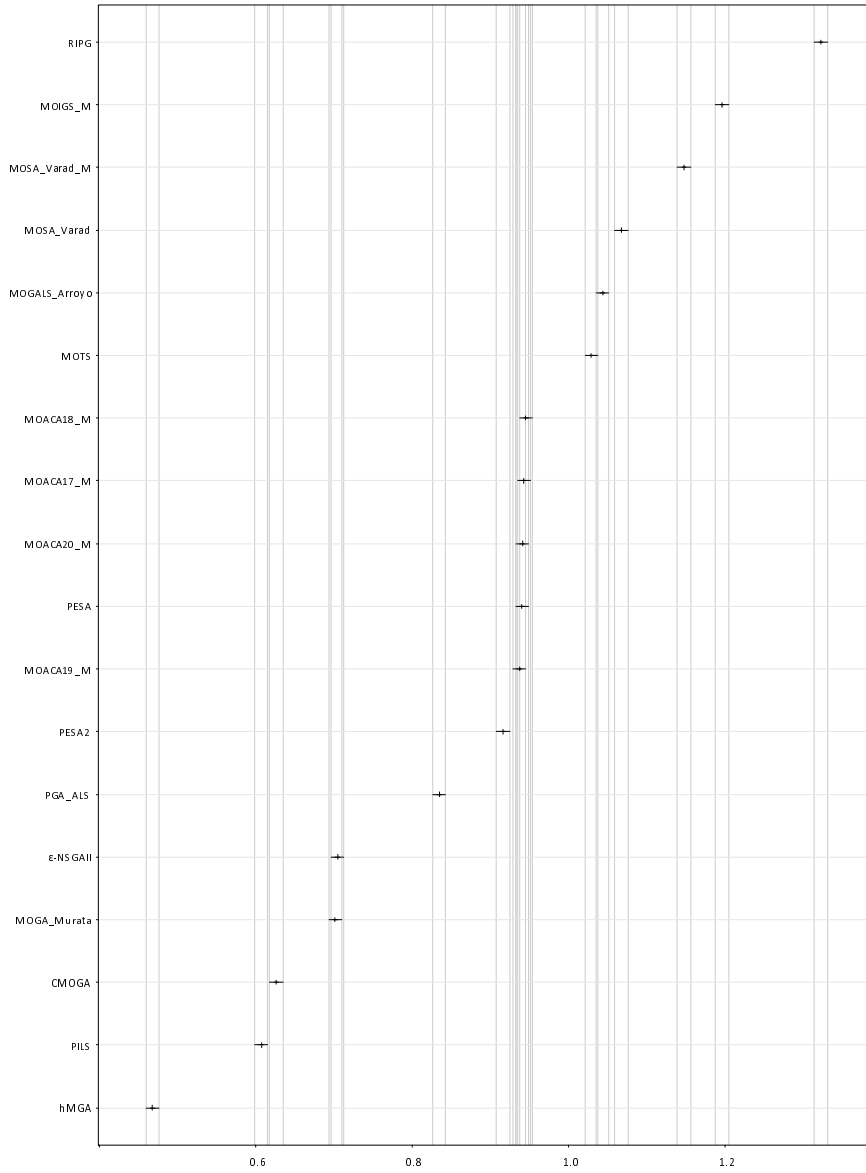


Figure 3.6: SSD125 instance set where setup times length is 125% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01$, $\alpha = 0.05$) for the algorithm factor in the ANOVA experiment. Hypervolume response variable and $t = 150ms$ CPU time stopping criterion. Makespan and total flowtime criteria.

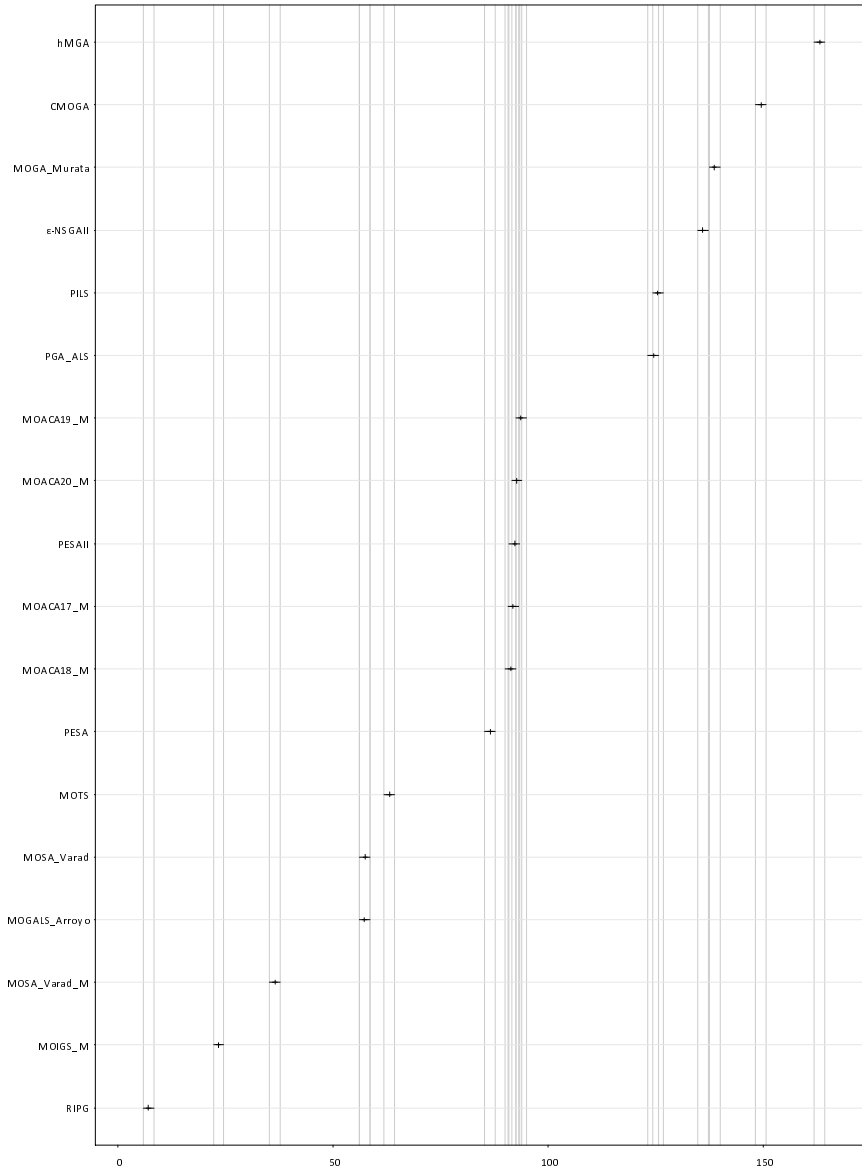


Figure 3.7: SSD125 instance set where setup times length is 125% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01$, $\alpha = 0.05$) for the algorithm factor in the Friedman rank-based experiment. Epsilon indicator response variable and $t = 150ms$ CPU time stopping criterion. Makespan and total flowtime criteria.

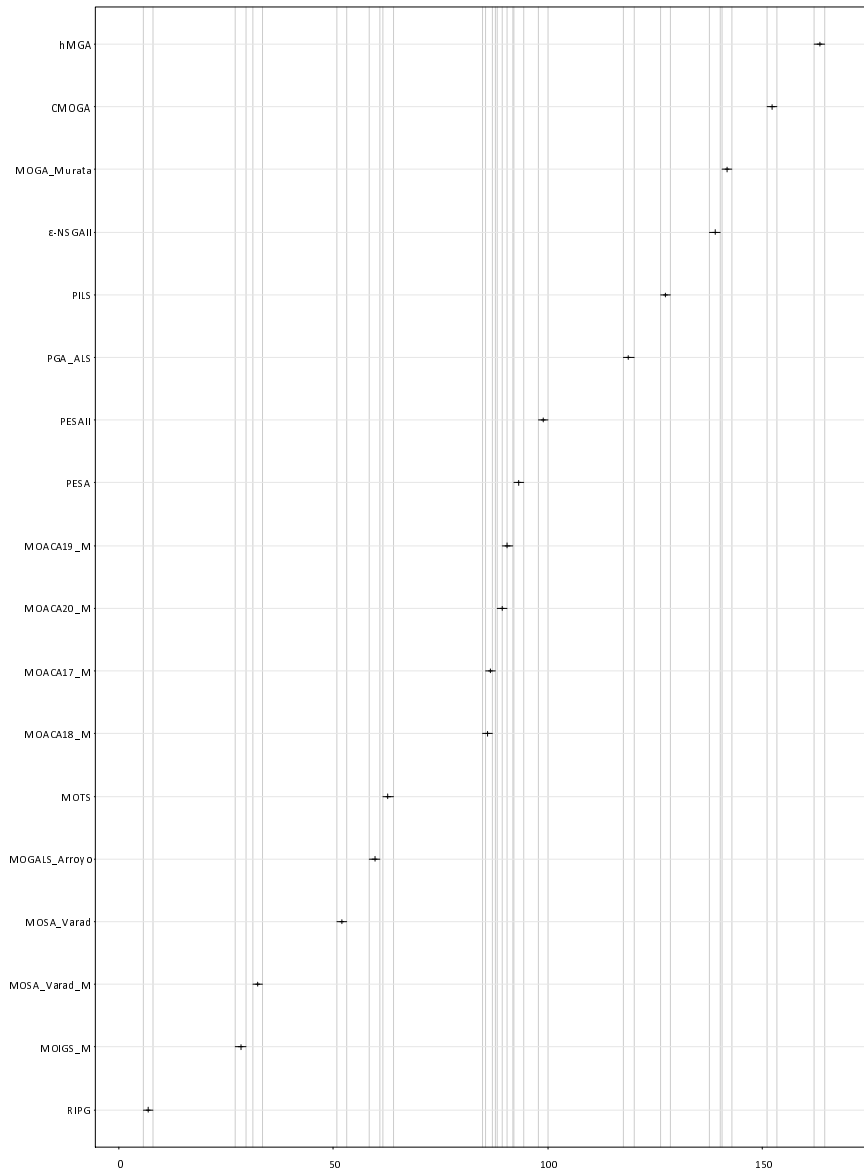


Figure 3.8: SSD125 instance set where setup times length is 125% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01, \alpha = 0.05$) for the algorithm factor in the Friedman rank-based experiment. Hypervolume response variable and $t = 150ms$ CPU time stopping criterion. Makespan and total flowtime criteria.

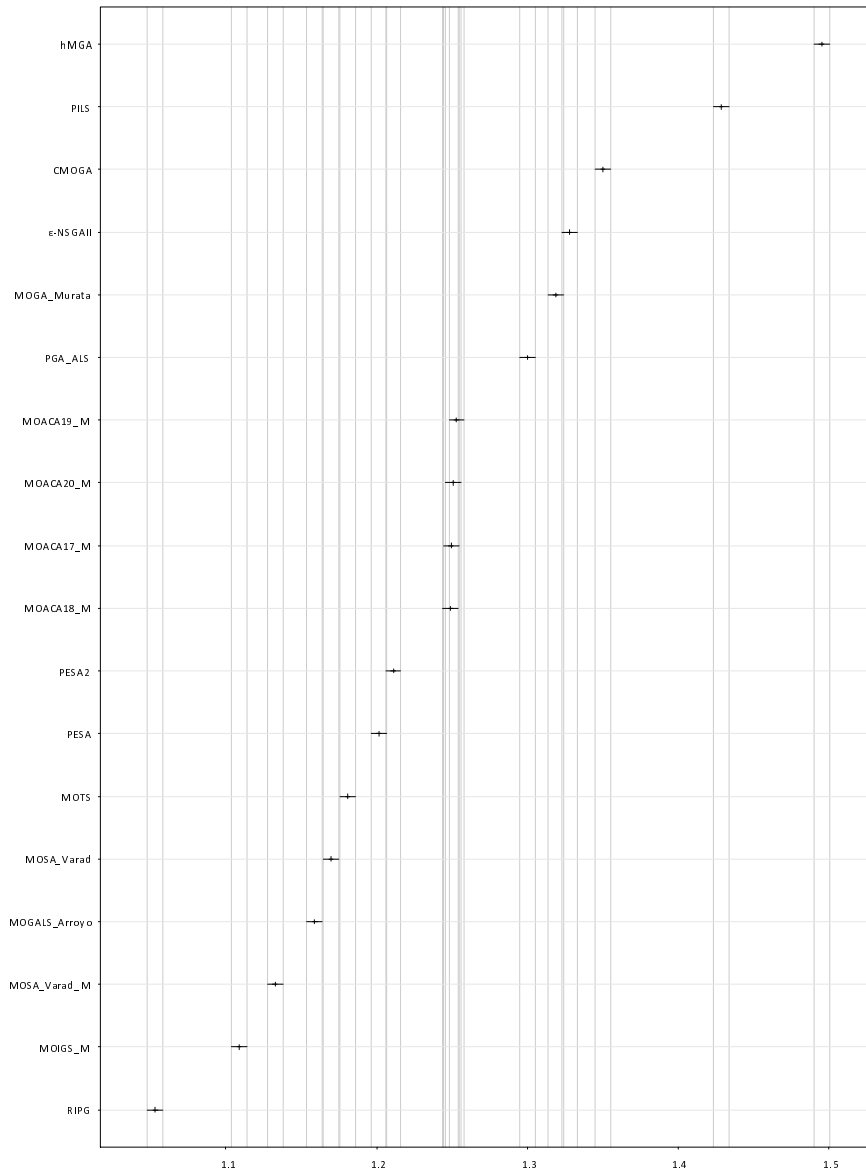


Figure 3.9: SSD50 instance set where setup times length is 50% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01$, $\alpha = 0.05$) for the algorithm factor in the ANOVA experiment. Epsilon indicator response variable and $t = 200ms$ CPU time stopping criterion. Makespan and total flowtime criteria.

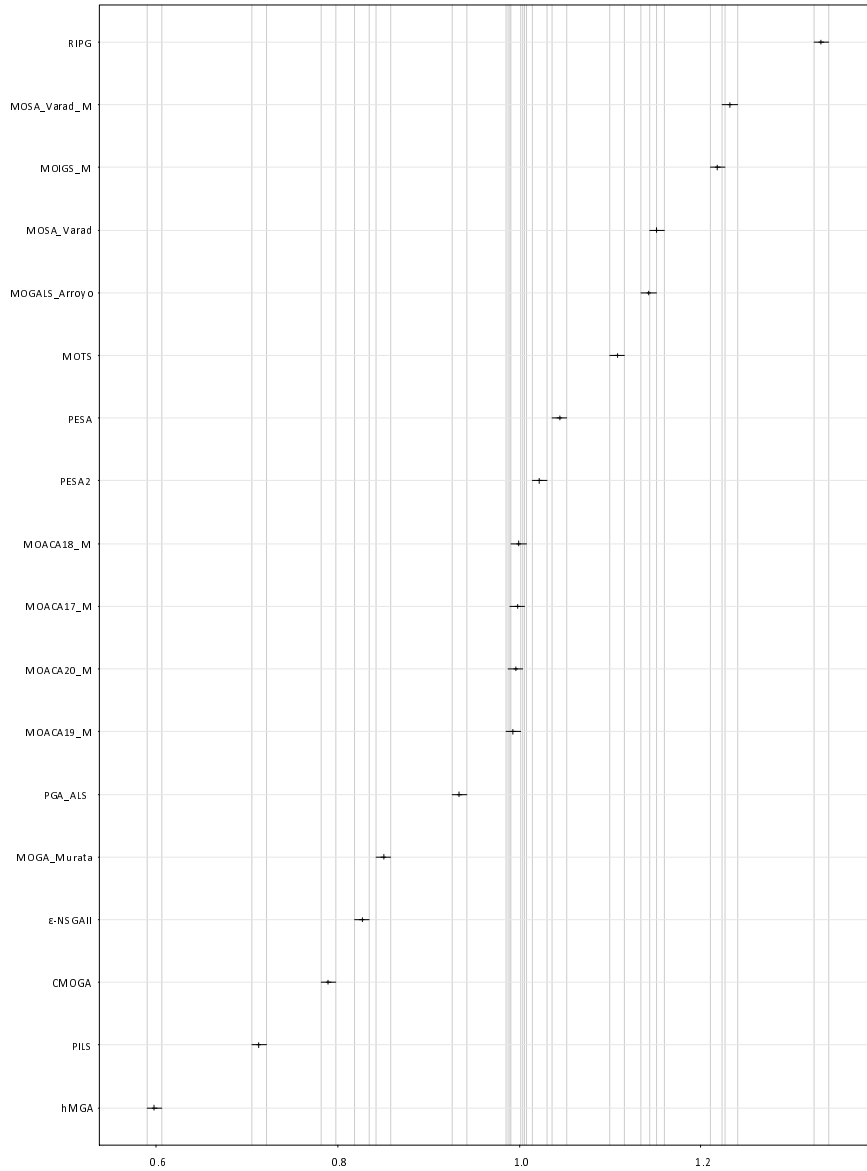


Figure 3.10: SSD50 instance set where setup times length is 50% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01, \alpha = 0.05$) for the algorithm factor in the ANOVA experiment. Hypervolume response variable and $t = 200ms$ CPU time stopping criterion. Makespan and total flowtime criteria.

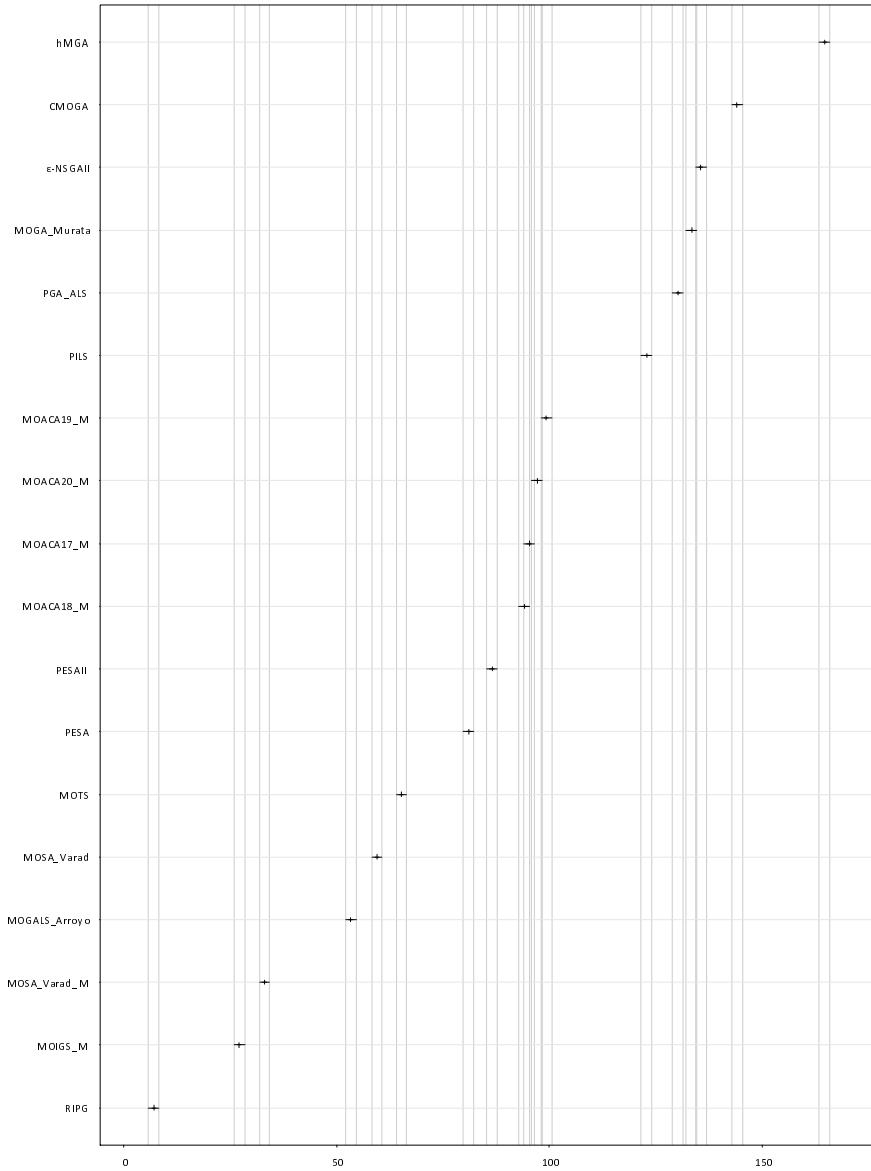


Figure 3.11: SSD50 instance set where setup times length is 50% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01$, $\alpha = 0.05$) for the algorithm factor in the Friedman rank-based experiment. Epsilon indicator response variable and $t = 200ms$ CPU time stopping criterion. Makespan and total flowtime criteria.

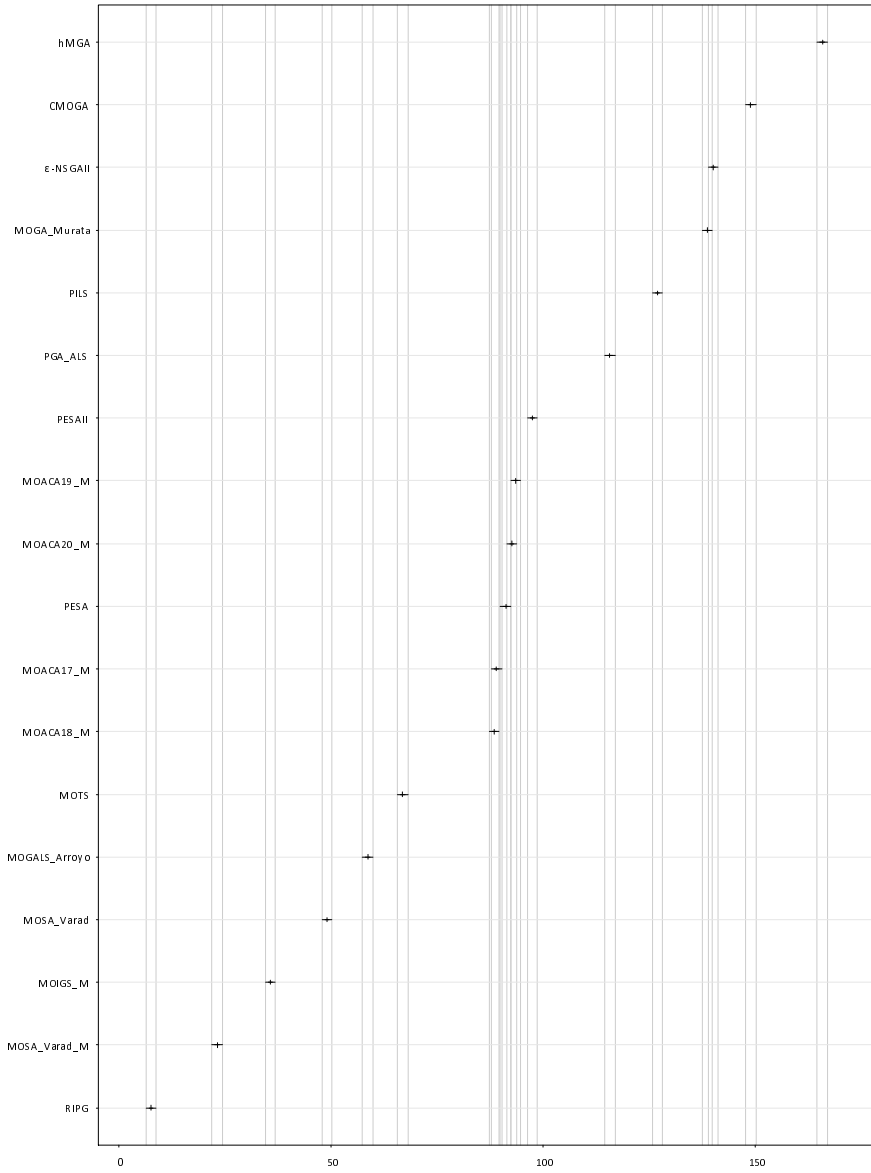


Figure 3.12: SSD50 instance set where setup times length is 50% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01, \alpha = 0.05$) for the algorithm factor in the Friedman rank-based experiment. Hypervolume response variable and $t = 200ms$ CPU time stopping criterion. Makespan and total flowtime criteria.

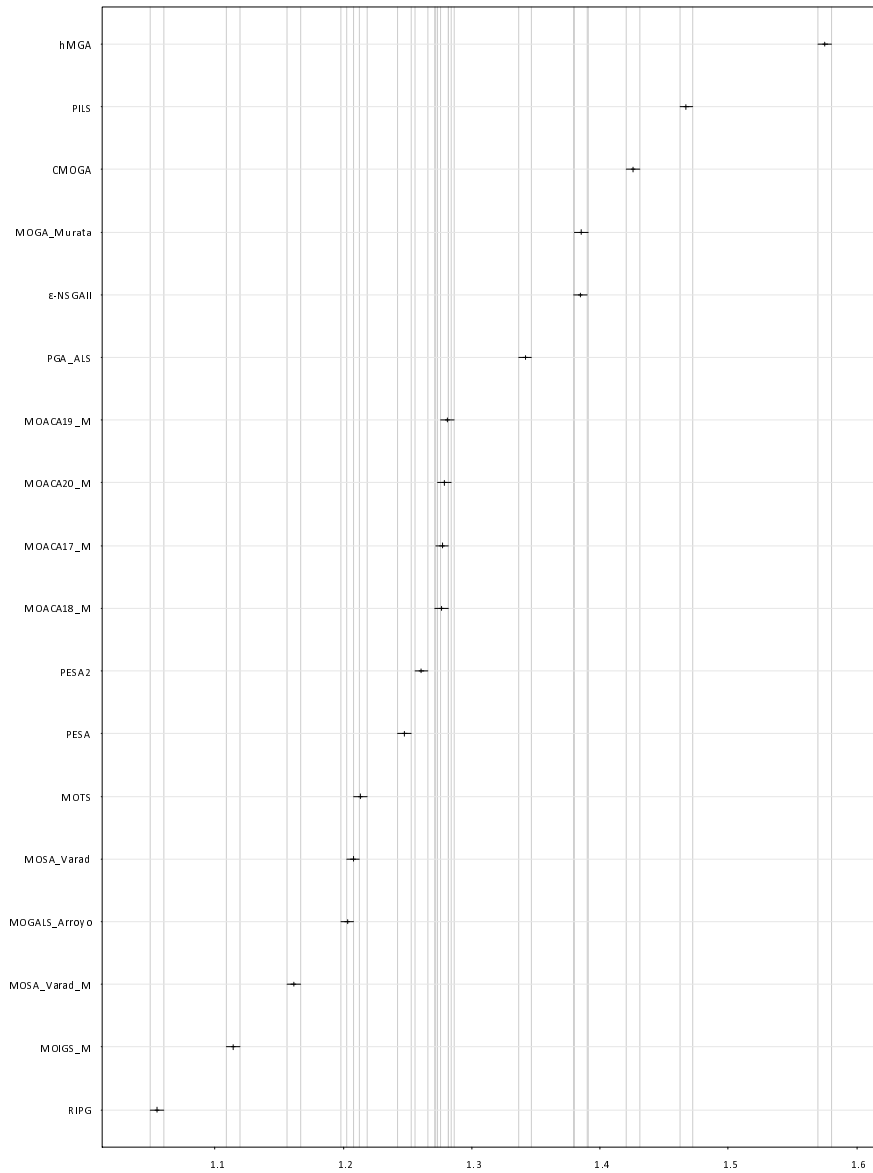


Figure 3.13: SSD125 instance set where setup times length is 125% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01$, $\alpha = 0.05$) for the algorithm factor in the ANOVA experiment. Epsilon indicator response variable and $t = 200ms$ CPU time stopping criterion. Makespan and total flowtime criteria.

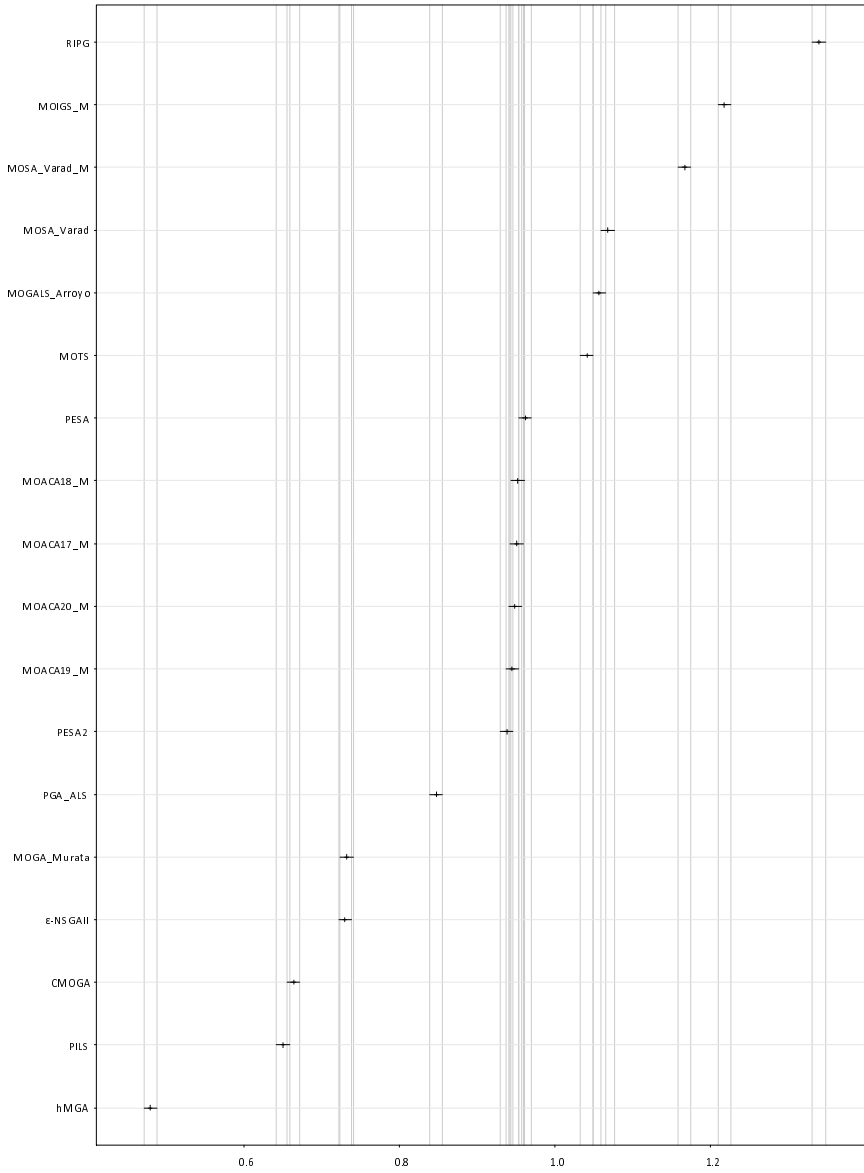


Figure 3.14: SSD125 instance set where setup times length is 125% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01, \alpha = 0.05$) for the algorithm factor in the ANOVA experiment. Hypervolume response variable and $t = 200ms$ CPU time stopping criterion. Makespan and total flowtime criteria.

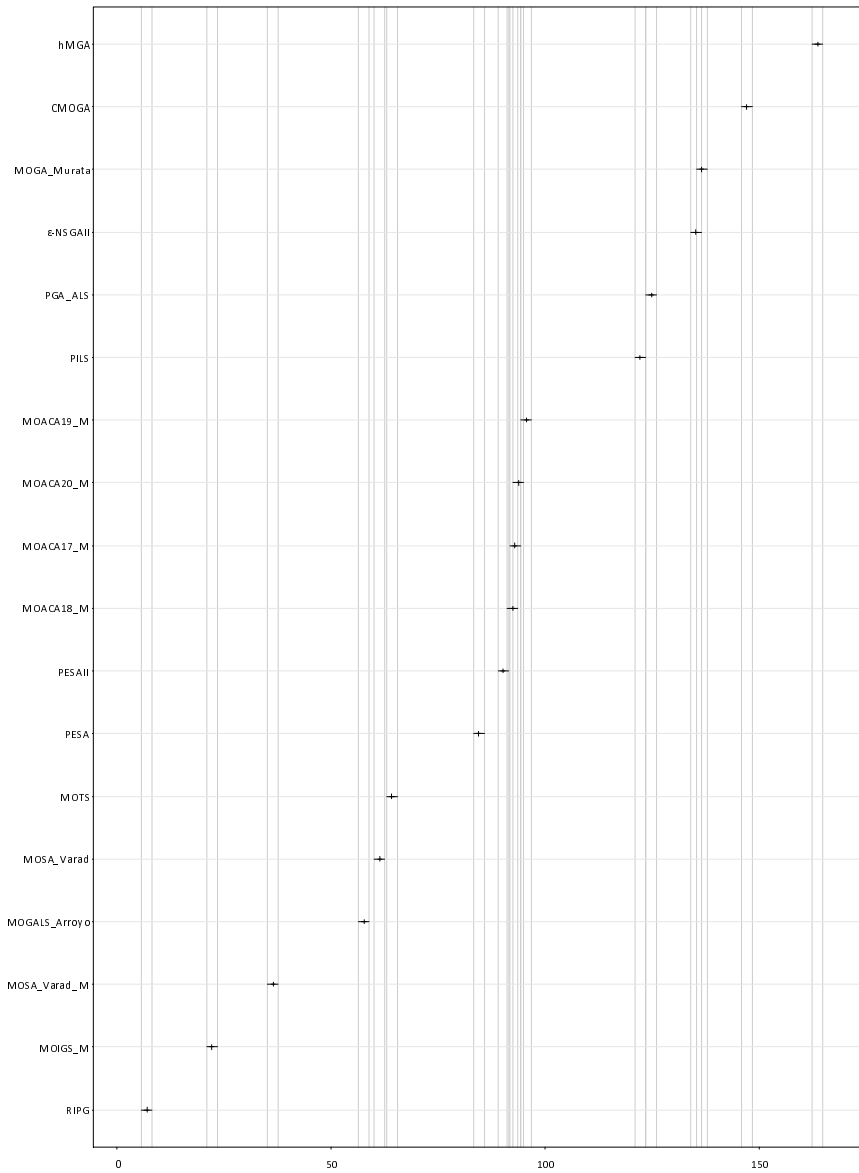


Figure 3.15: SSD125 instance set where setup times length is 125% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01$, $\alpha = 0.05$) for the algorithm factor in the Friedman rank-based experiment. Epsilon indicator response variable and $t = 200ms$ CPU time stopping criterion. Makespan and total flowtime criteria.

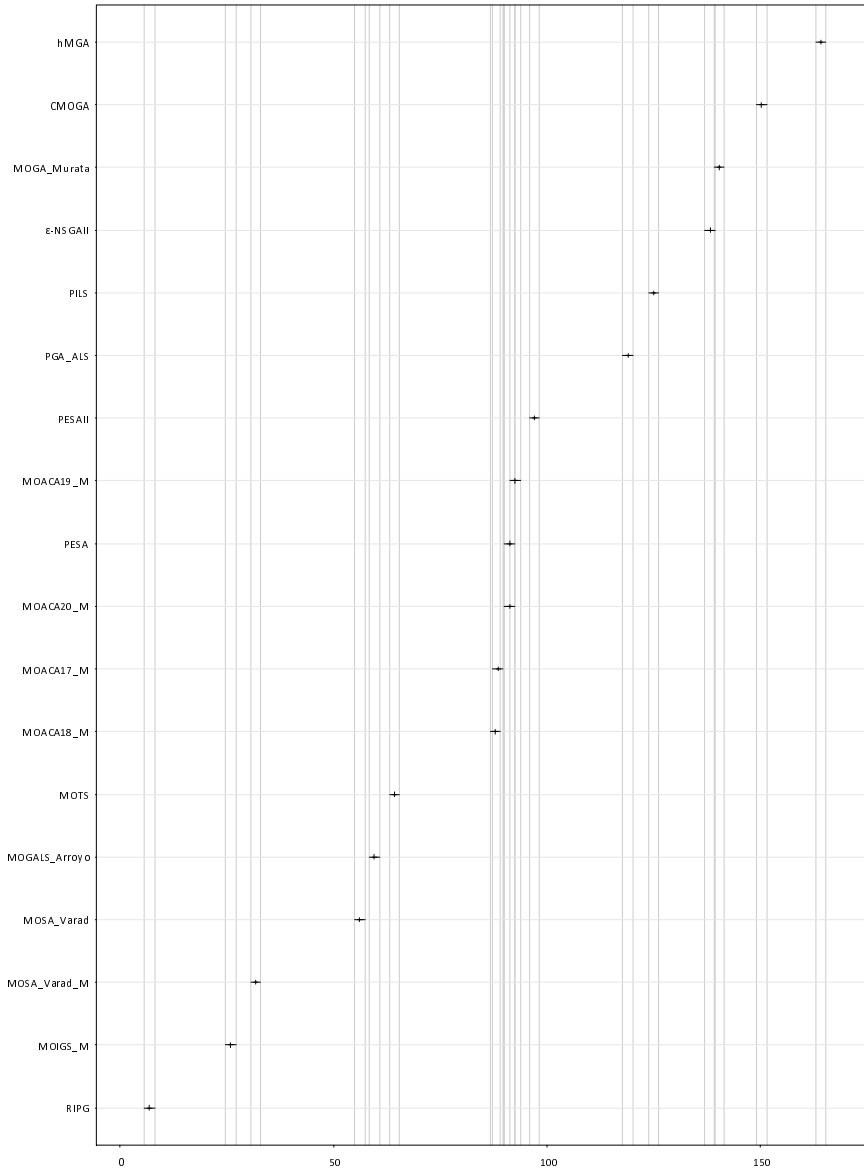


Figure 3.16: SSD125 instance set where setup times length is 125% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01, \alpha = 0.05$) for the algorithm factor in the Friedman rank-based experiment. Hypervolume response variable and $t = 200ms$ CPU time stopping criterion. Makespan and total flowtime criteria.

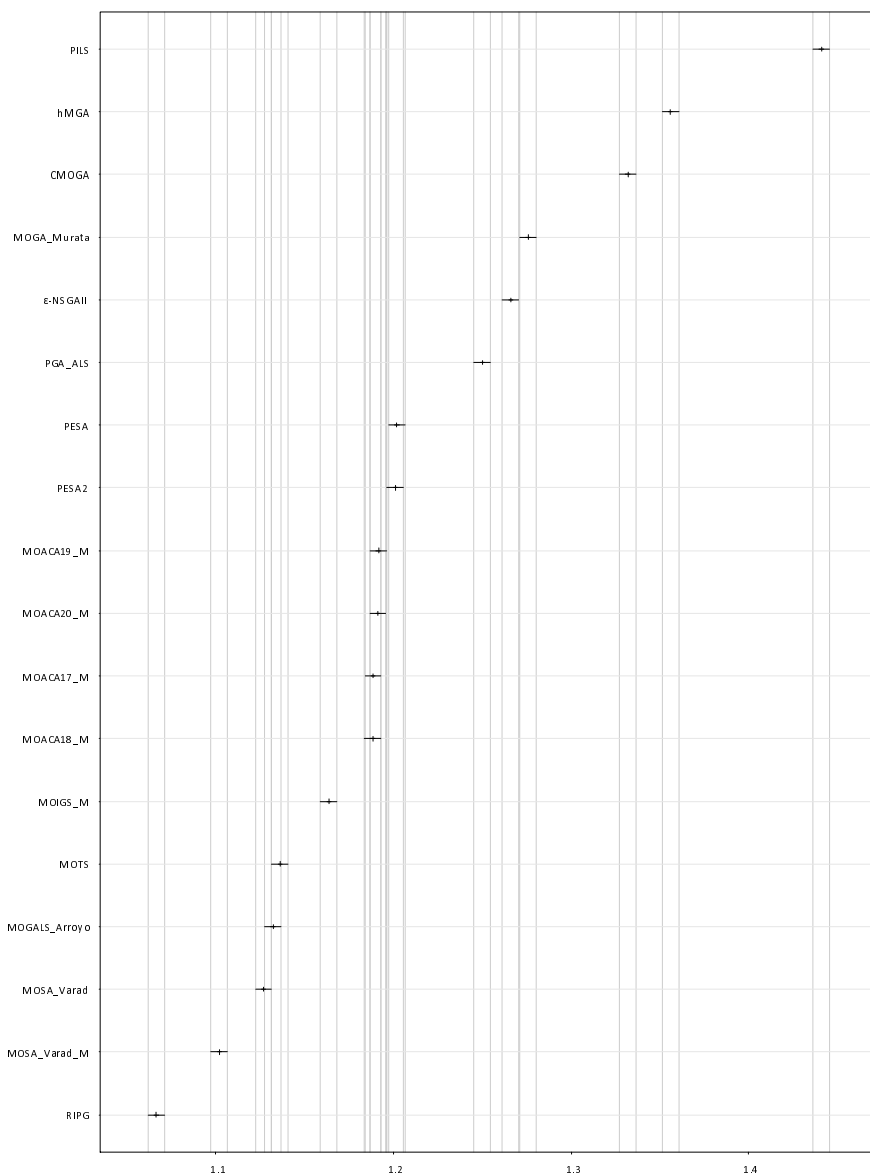


Figure 3.17: SSD50 instance set where setup times length is 50% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01$, $\alpha = 0.05$) for the algorithm factor in the ANOVA experiment. Epsilon indicator response variable and $t = 150ms$ CPU time stopping criterion. Makespan and total weighted tardiness criteria.

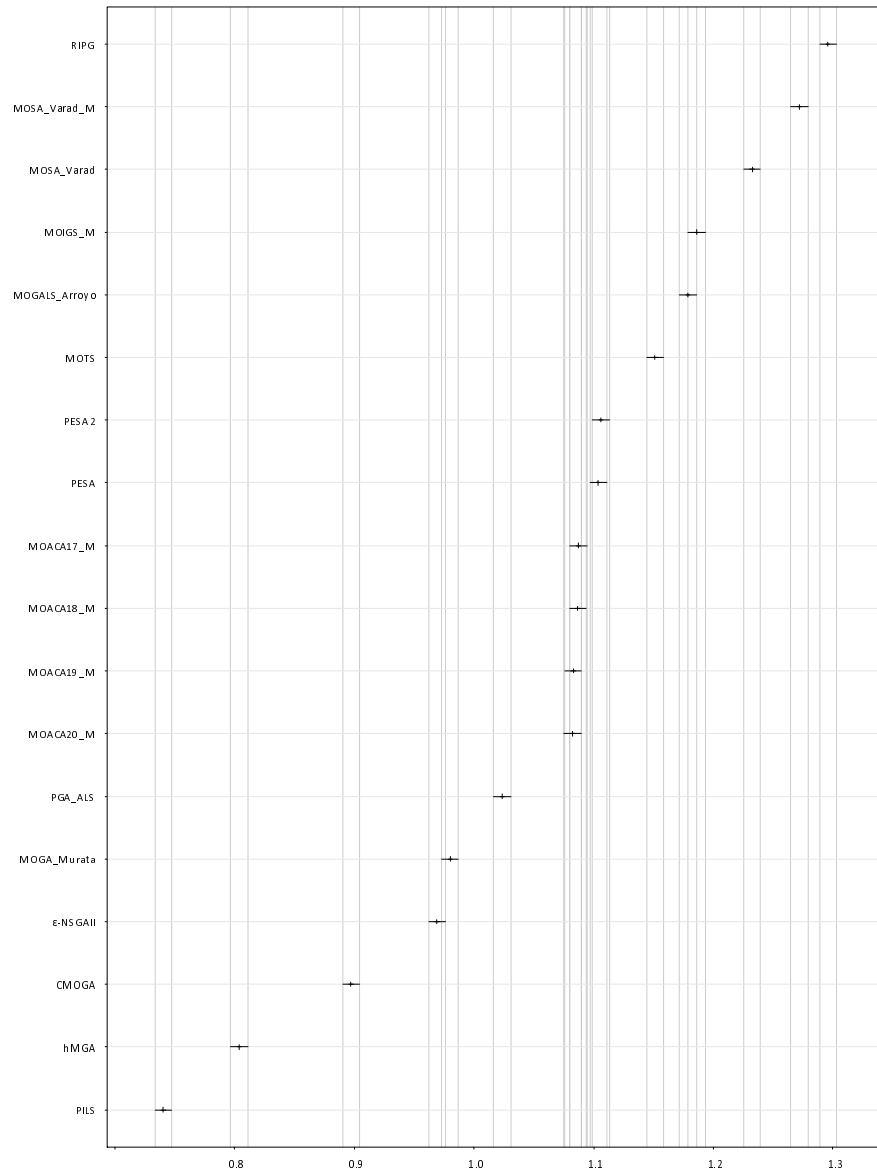


Figure 3.18: SSD50 instance set where setup times length is 50% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01$, $\alpha = 0.05$) for the algorithm factor in the ANOVA experiment. Hypervolume response variable and $t = 150ms$ CPU time stopping criterion. Makespan and total weighted tardiness criteria.

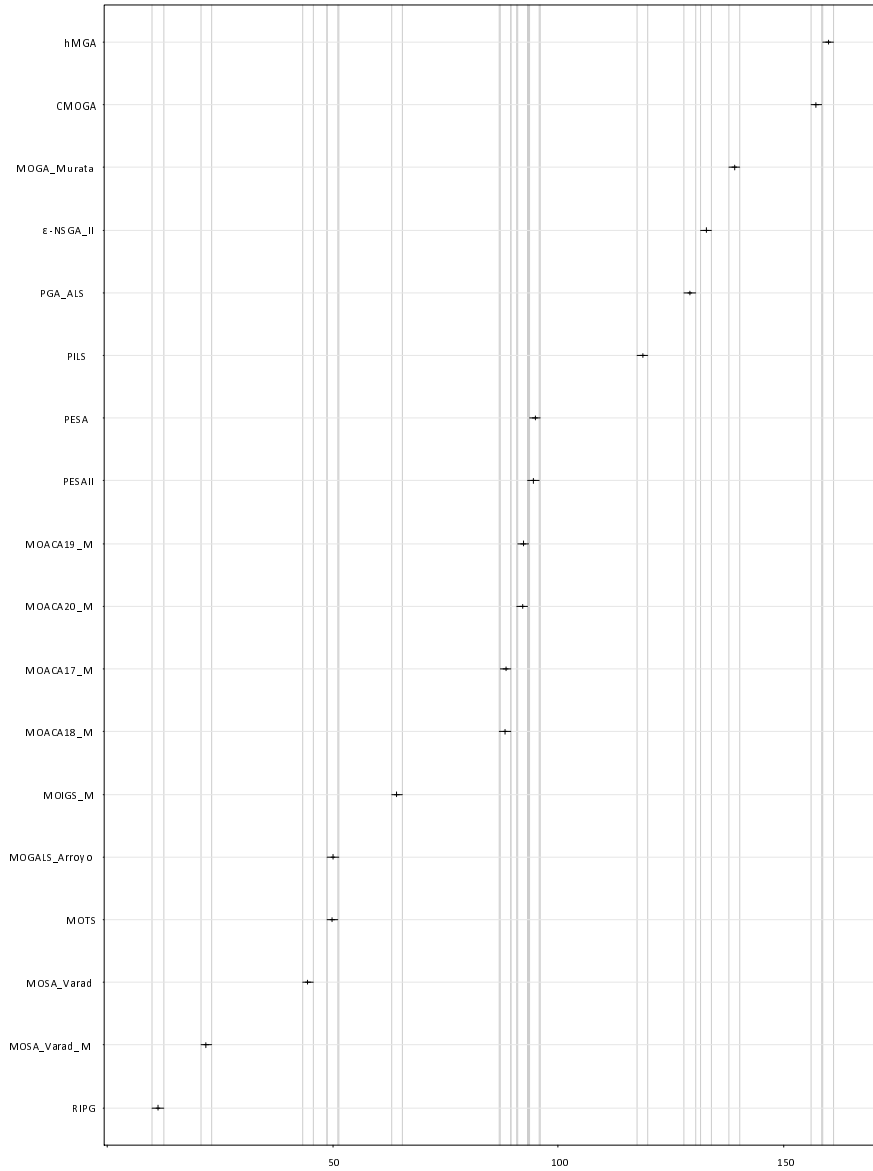


Figure 3.19: SSD50 instance set where setup times length is 50% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01$, $\alpha = 0.05$) for the algorithm factor in the Friedman rank-based experiment. Epsilon indicator response variable and $t = 150ms$ CPU time stopping criterion. Makespan and total weighted tardiness criteria.

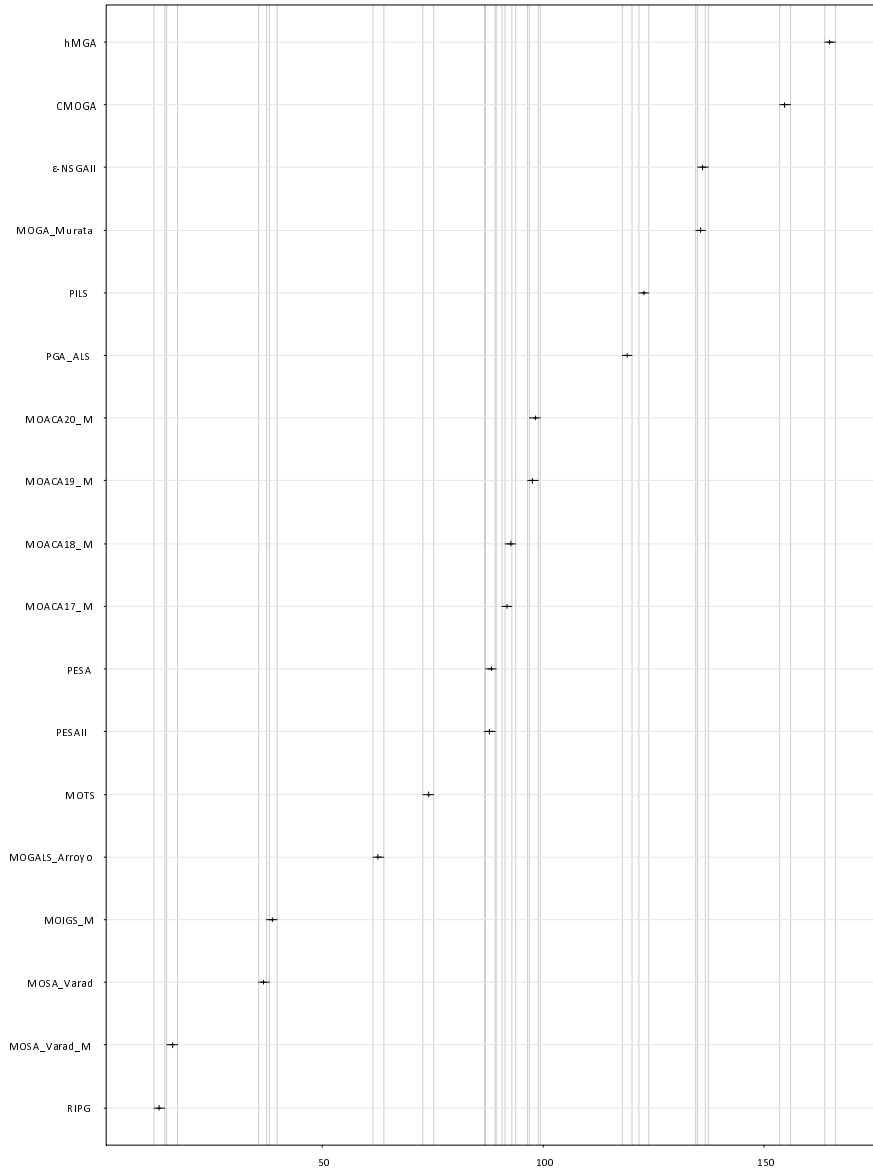


Figure 3.20: SSD50 instance set where setup times length is 50% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01$, $\alpha = 0.05$) for the algorithm factor in the Friedman rank-based experiment. Hypervolume response variable and $t = 150ms$ CPU time stopping criterion. Makespan and total weighted tardiness criteria.

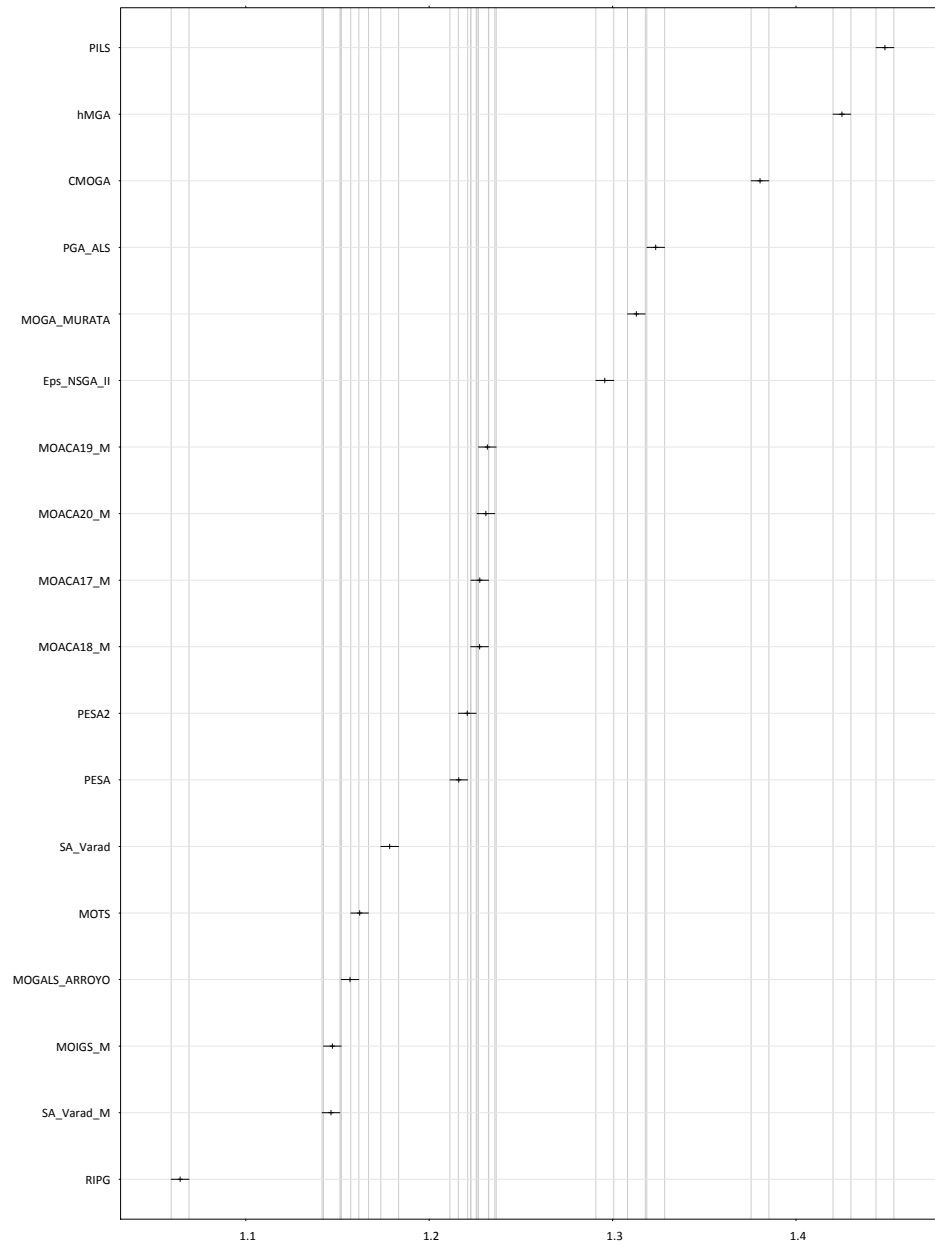


Figure 3.21: SSD125 instance set where setup times length is 125% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01$, $\alpha = 0.05$) for the algorithm factor in the ANOVA experiment. Epsilon indicator response variable and $t = 150ms$ CPU time stopping criterion. Makespan and total weighted tardiness criteria.

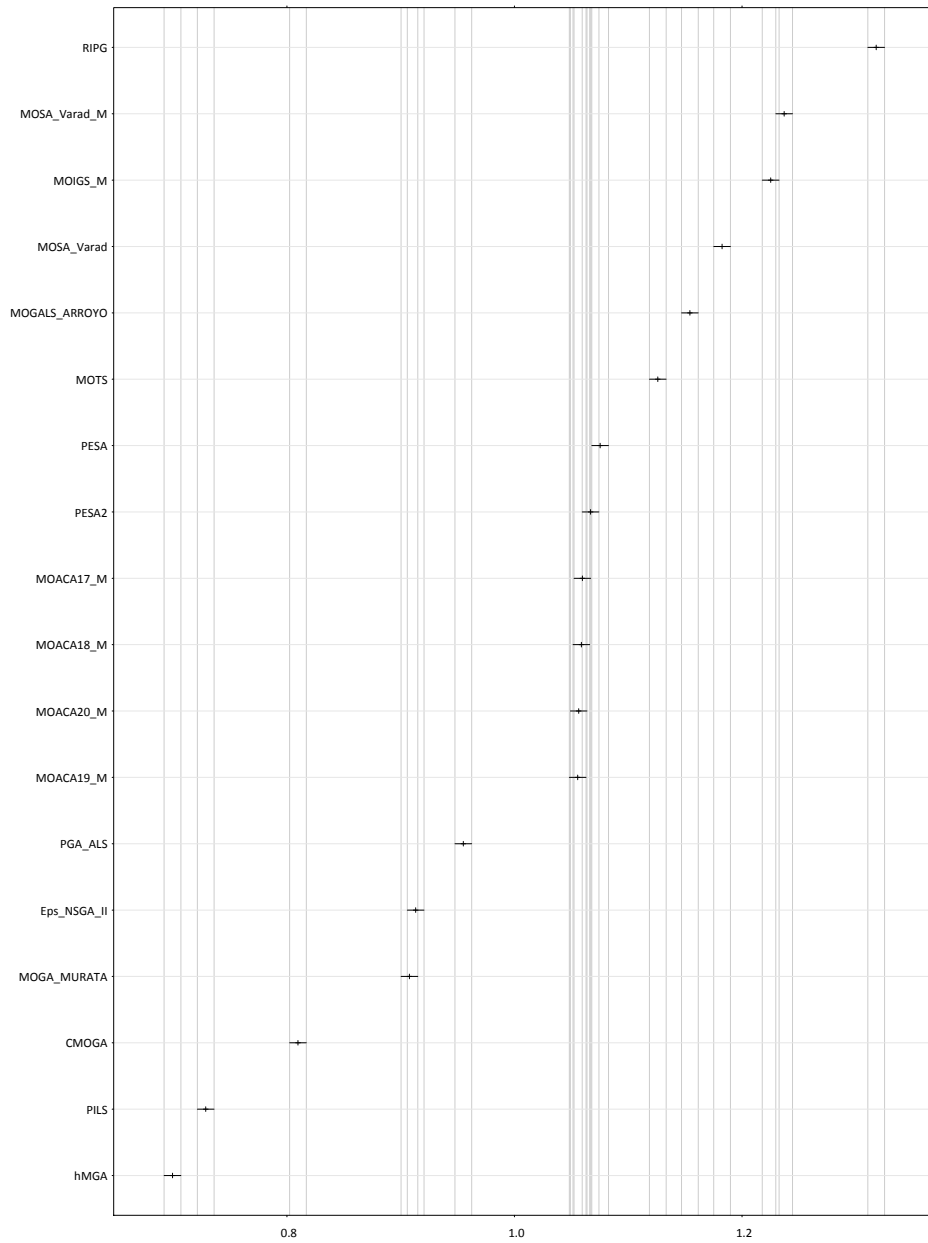


Figure 3.22: SSD125 instance set where setup times length is 125% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01$, $\alpha = 0.05$) for the algorithm factor in the ANOVA experiment. Hypervolume response variable and $t = 150ms$ CPU time stopping criterion. Makespan and total weighted tardiness criteria.

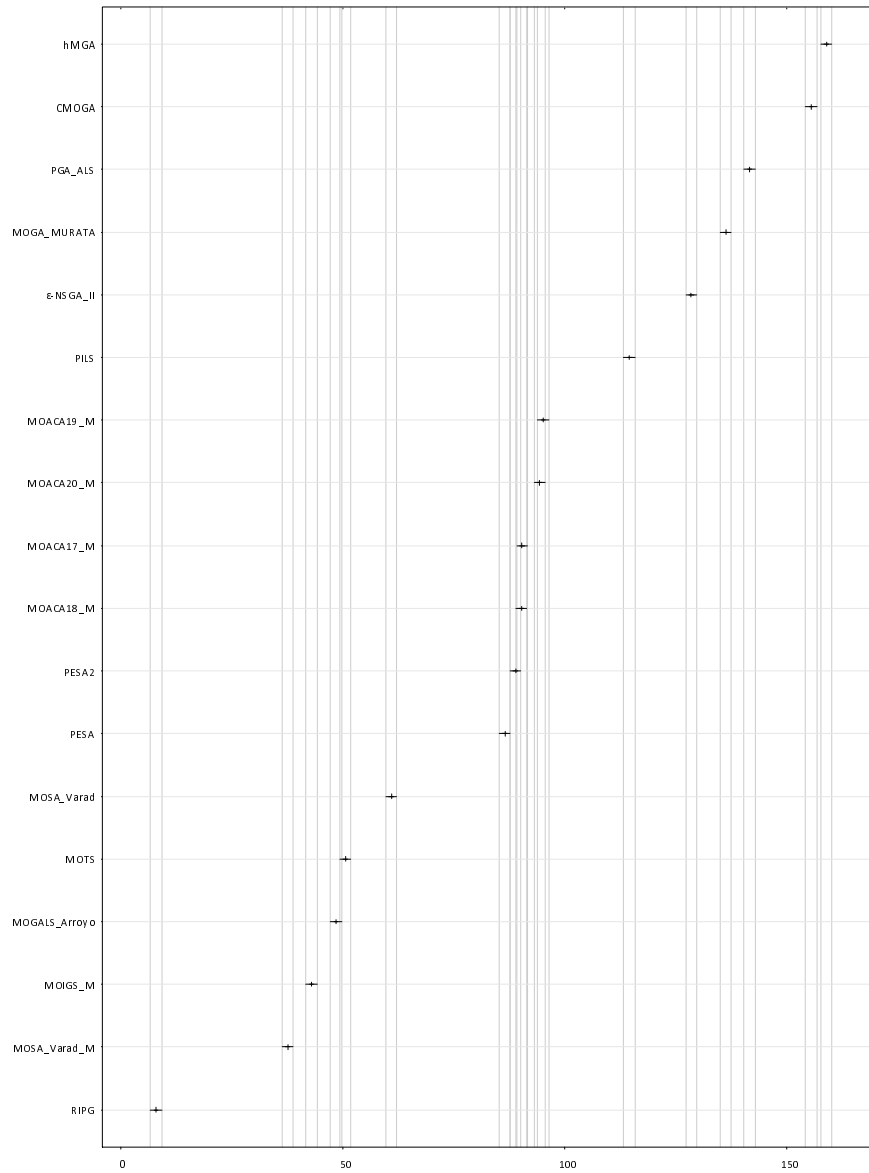


Figure 3.23: SSD125 instance set where setup times length is 125% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01$, $\alpha = 0.05$) for the algorithm factor in the Friedman rank-based experiment. Epsilon indicator response variable and $t = 150ms$ CPU time stopping criterion. Makespan and total weighted tardiness criteria.

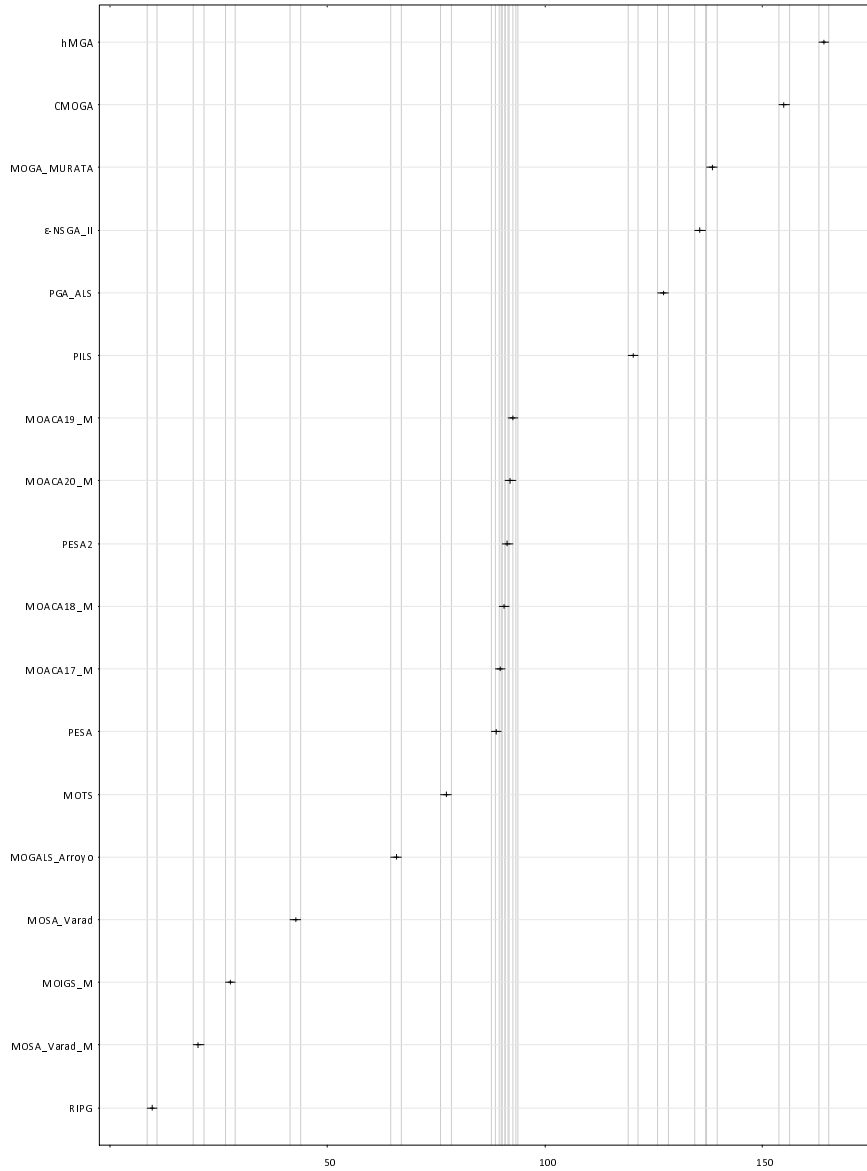


Figure 3.24: SSD125 instance set where setup times length is 125% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01, \alpha = 0.05$) for the algorithm factor in the Friedman rank-based experiment. Hypervolume response variable and $t = 150ms$ CPU time stopping criterion. Makespan and total weighted tardiness criteria.

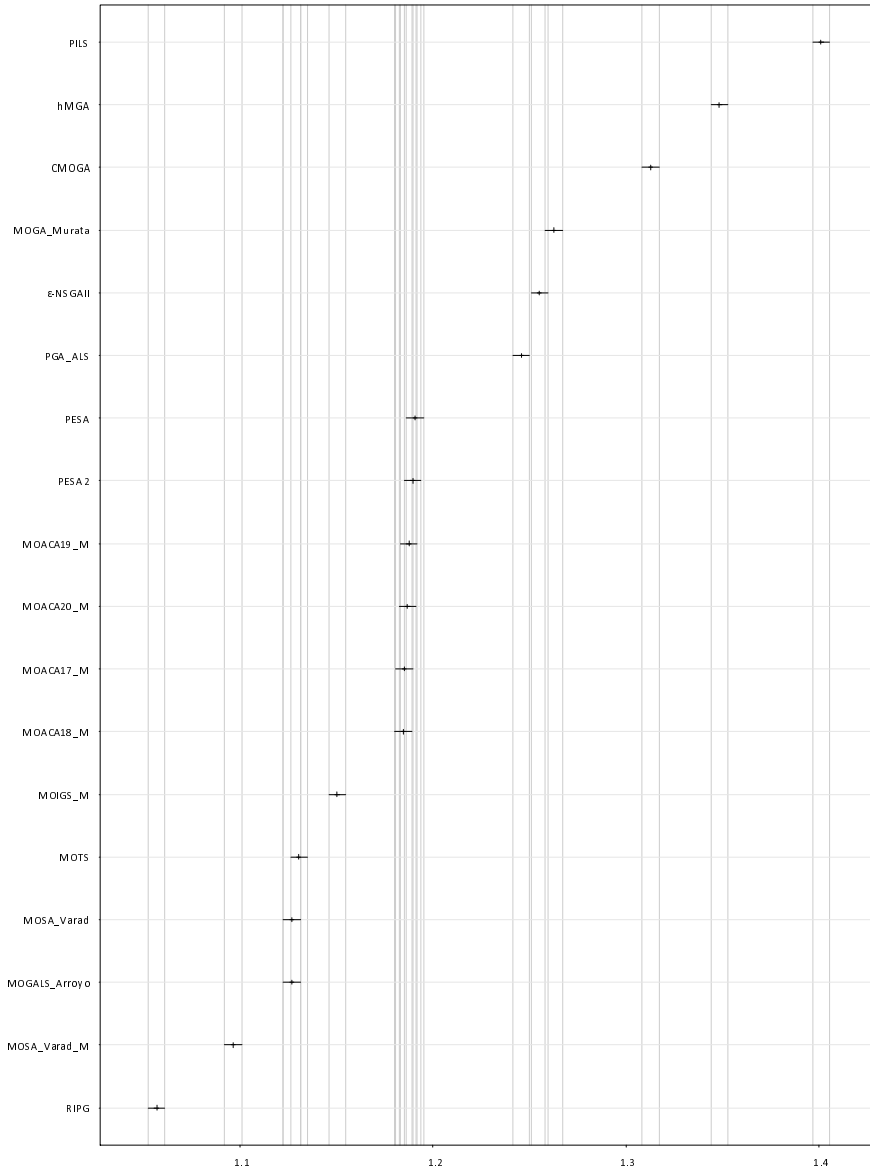


Figure 3.25: SSD50 instance set where setup times length is 50% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01$, $\alpha = 0.05$) for the algorithm factor in the ANOVA experiment. Epsilon indicator response variable and $t = 200ms$ CPU time stopping criterion. Makespan and total weighted tardiness criteria.

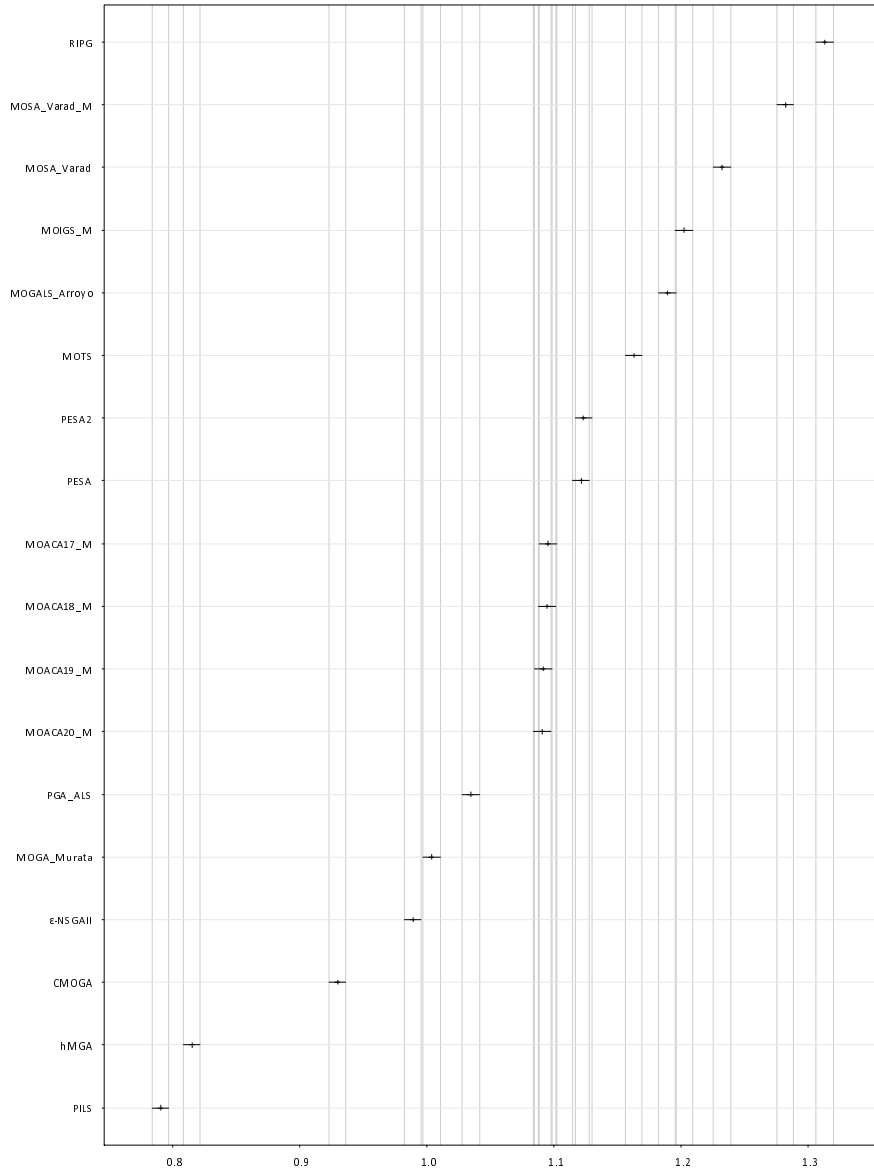


Figure 3.26: SSD50 instance set where setup times length is 50% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01, \alpha = 0.05$) for the algorithm factor in the ANOVA experiment. Hypervolume response variable and $t = 200ms$ CPU time stopping criterion. Makespan and total weighted tardiness criteria.

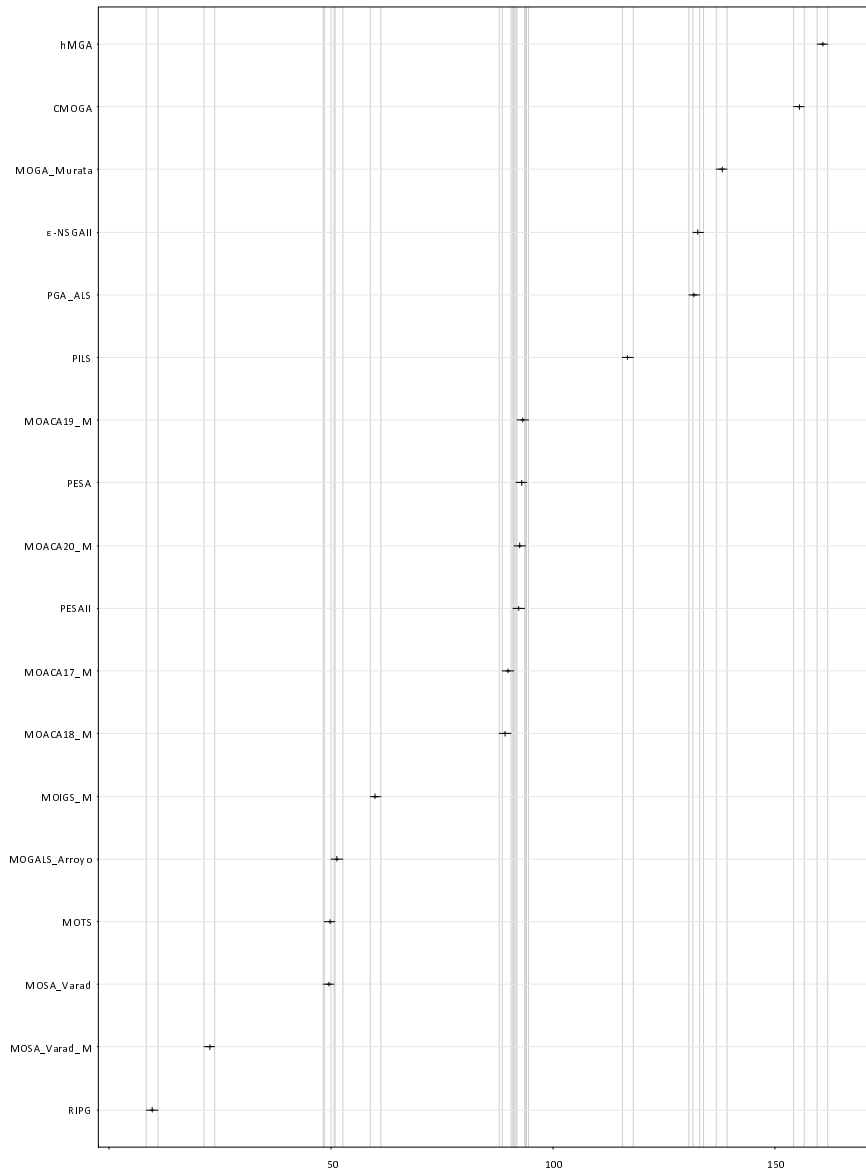


Figure 3.27: SSD50 instance set where setup times length is 50% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01$, $\alpha = 0.05$) for the algorithm factor in the Friedman rank-based experiment. Epsilon indicator response variable and $t = 200ms$ CPU time stopping criterion. Makespan and total weighted tardiness criteria.

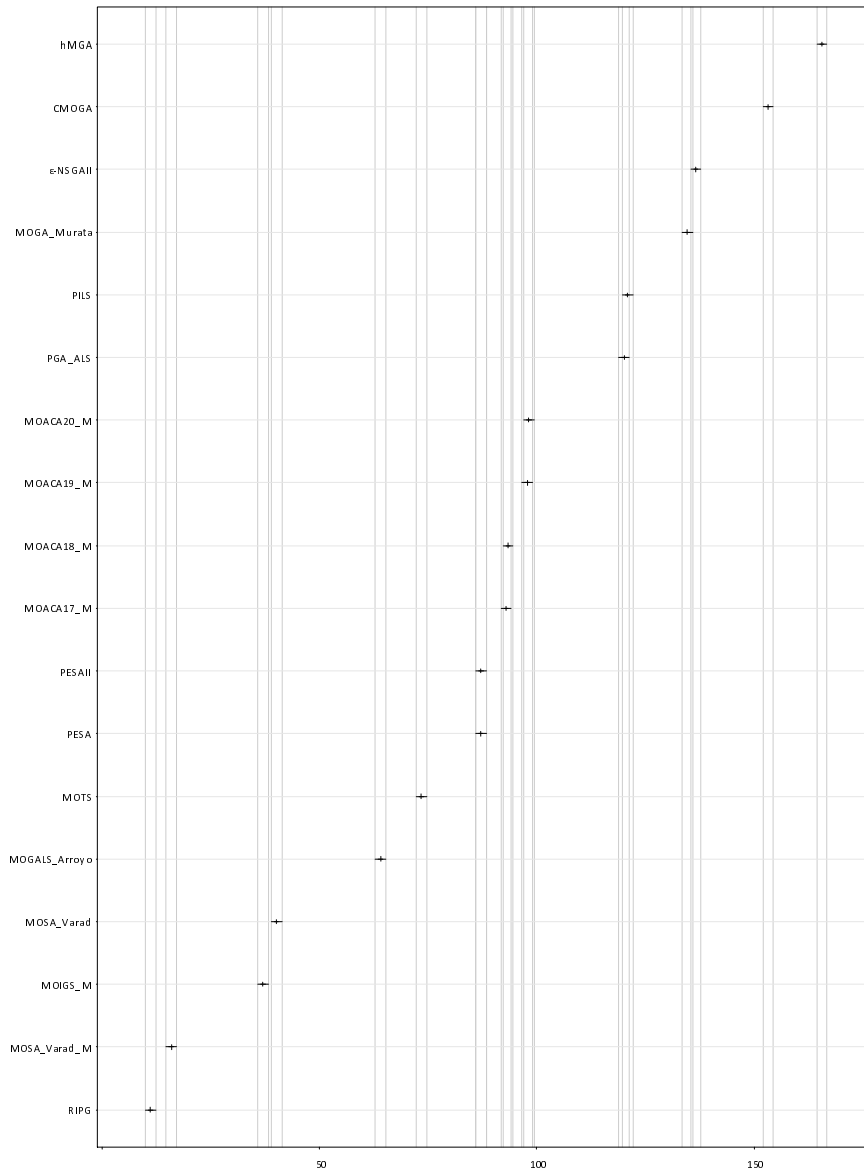


Figure 3.28: SSD50 instance set where setup times length is 50% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01$, $\alpha = 0.05$) for the algorithm factor in the Friedman rank-based experiment. Hypervolume response variable and $t = 200ms$ CPU time stopping criterion. Makespan and total weighted tardiness criteria.

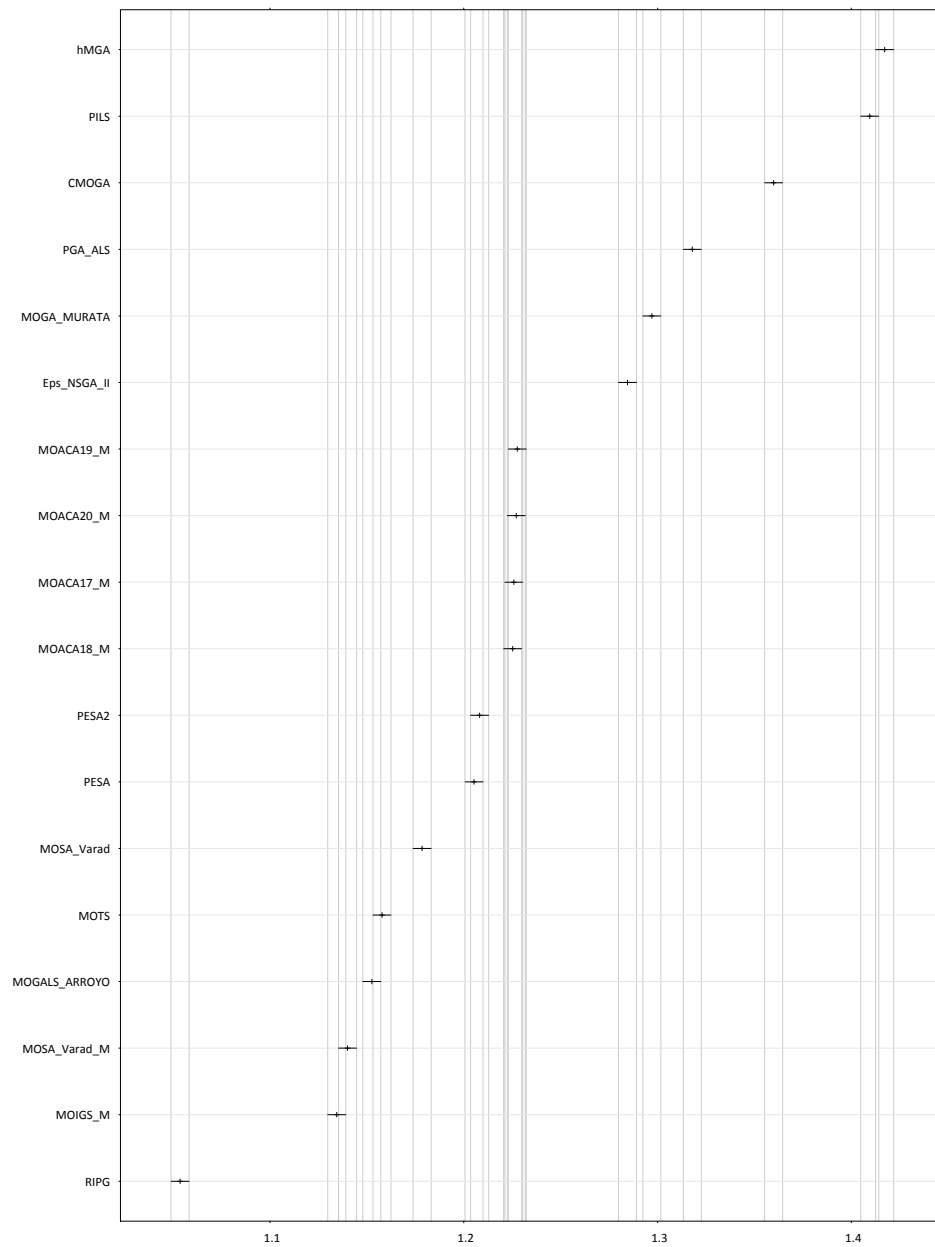


Figure 3.29: SSD125 instance set where setup times length is 125% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01$, $\alpha = 0.05$) for the algorithm factor in the ANOVA experiment. Epsilon indicator response variable and $t = 200ms$ CPU time stopping criterion. Makespan and total weighted tardiness criteria.

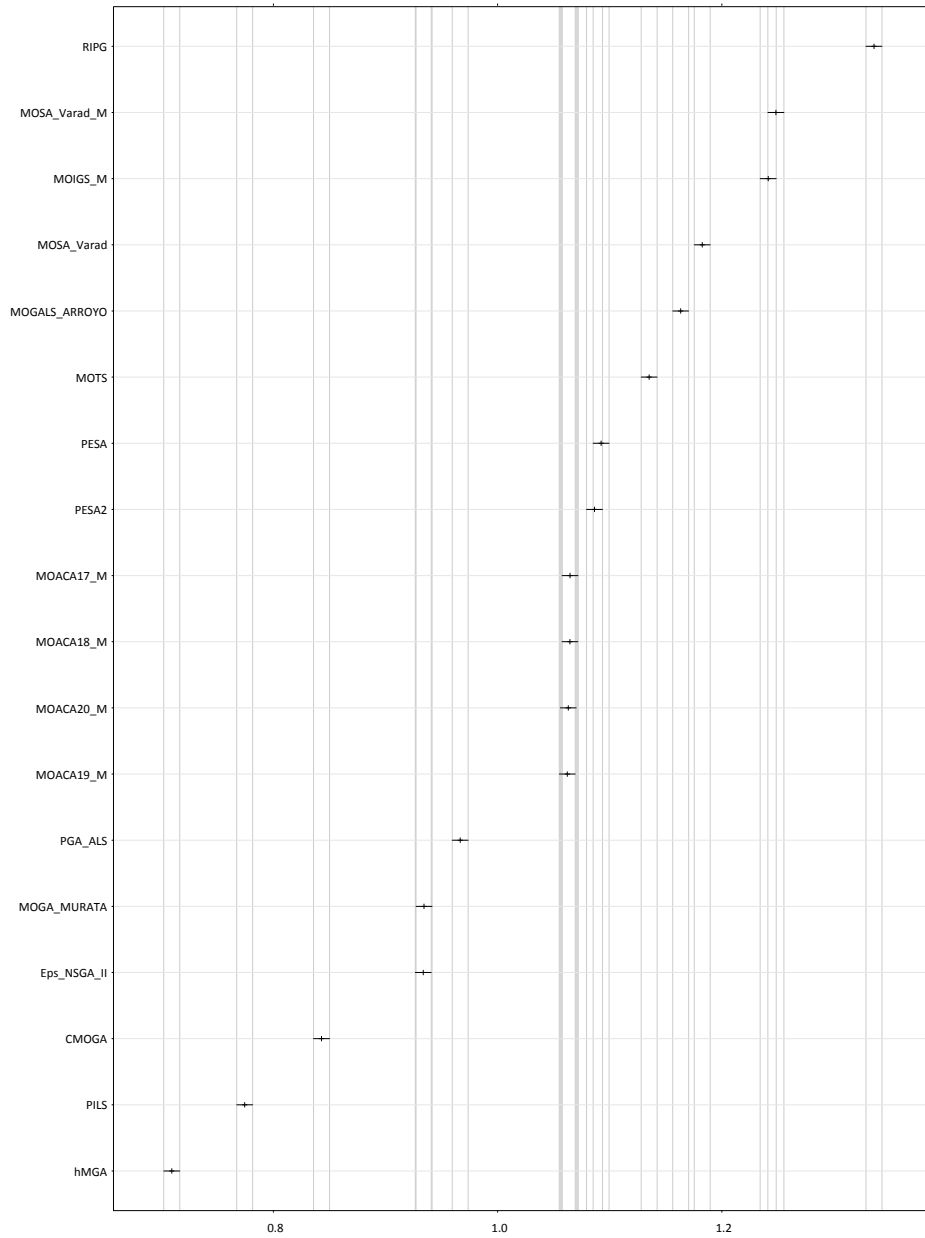


Figure 3.30: SSD125 instance set where setup times length is 125% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01, \alpha = 0.05$) for the algorithm factor in the ANOVA experiment. Hypervolume response variable and $t = 200ms$ CPU time stopping criterion. Makespan and total weighted tardiness criteria.

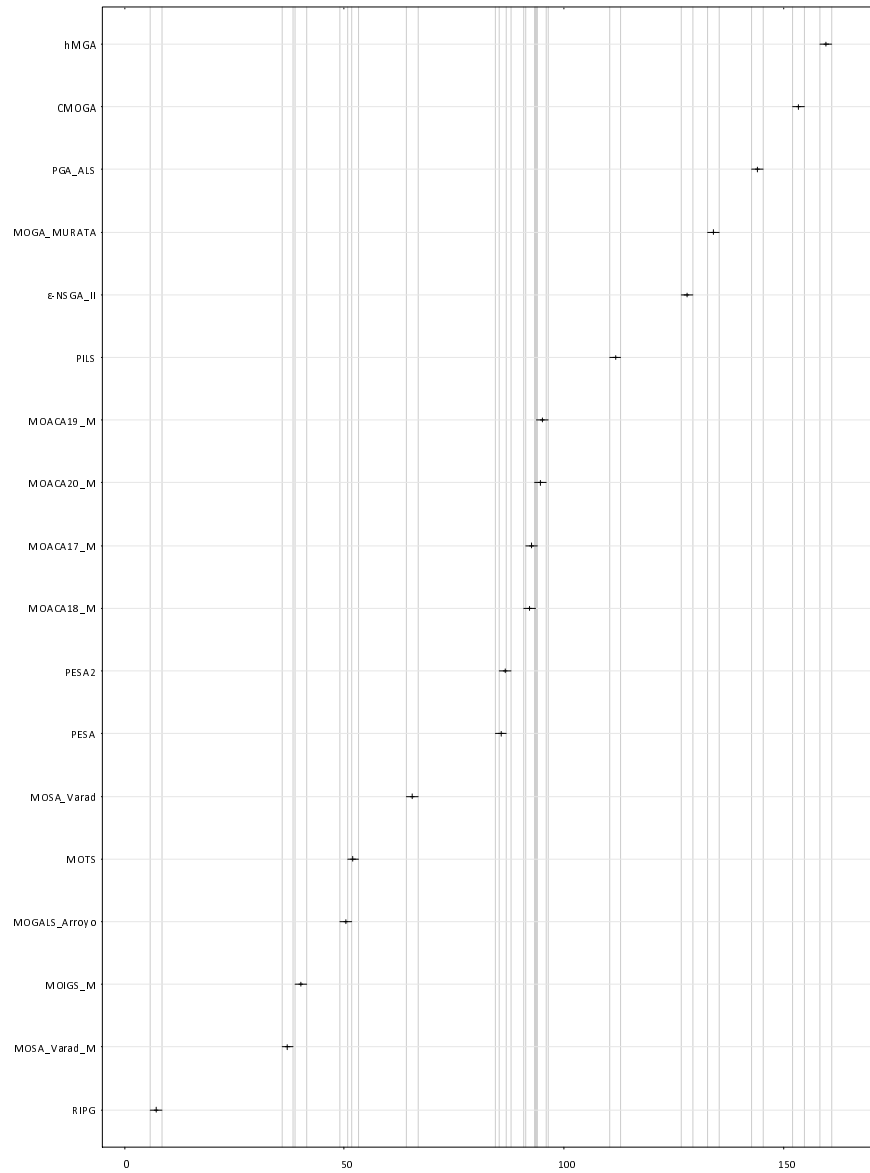


Figure 3.31: SSD125 instance set where setup times length is 125% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01$, $\alpha = 0.05$) for the algorithm factor in the Friedman rank-based experiment. Epsilon indicator response variable and $t = 200ms$ CPU time stopping criterion. Makespan and total weighted tardiness criteria.

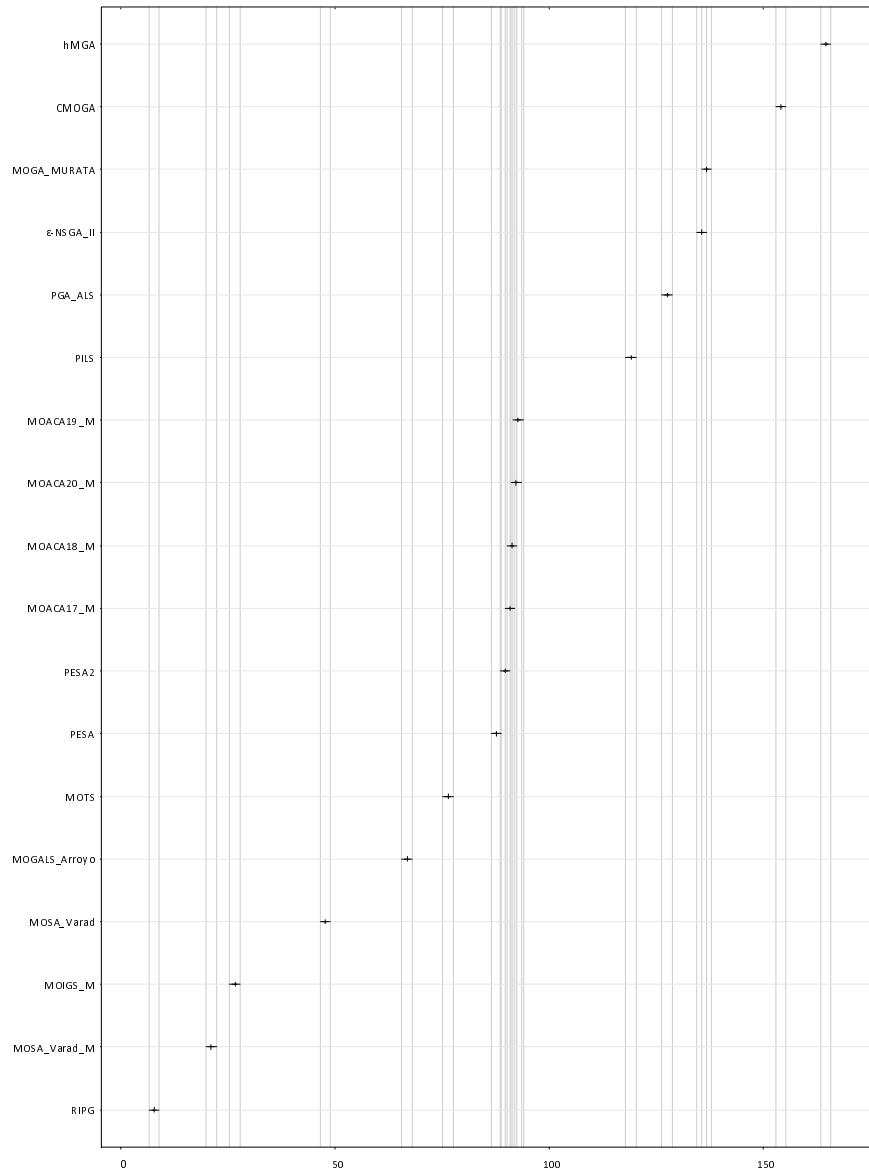


Figure 3.32: SSD125 instance set where setup times length is 125% the length of processing times. Means plot and Tukey HSD confidence intervals ($\alpha_s = 0.01$, $\alpha = 0.05$) for the algorithm factor in the Friedman rank-based experiment. Hypervolume response variable and $t = 200ms$ CPU time stopping criterion. Makespan and total weighted tardiness criteria.