Supplementary Material

for

What Works Best When? A Systematic Evaluation of Heuristics for Max-Cut and QUBO

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In this supplementary material, we give the CART models for each heuristic as described in Section 5.1, in the main paper. Table 1 summarizes the R^2 value of each fitted CART model and gives the list of relevant plots for all the 37 heuristics.

Heuristic	R^2	Figures	Heuristic	R^2	Figures	Heuristic	R^2	Figures
ALK98 BUR02 FES02GP FES02V GLO98	$\begin{array}{c} 0.52 \\ 0.58 \\ 0.76 \\ 0.30 \\ 0.54 \end{array}$	Figure 1 Figure 4 Figure 7 Figure 10 Figure 13	BEA98SA DUA05 FES02GV FES02VP HAS00GA	$\begin{array}{c} 0.38 \\ 0.54 \\ 0.58 \\ 0.22 \\ 0.52 \end{array}$	Figure 2 Figure 5 Figure 8 Figure 11 Figure 14	BEA98TS FES02G FES02GVP GLO10 HAS00TS	$\begin{array}{c} 0.74 \\ 0.78 \\ 0.68 \\ 0.49 \\ 0.49 \end{array}$	Figure 3 Figure 6 Figure 9 Figure 12 Figure 15
KATO0 LAG09HCE MER02GR MER02LSK MER99LS PAL04T1 PAL04T4 PAR08	$\begin{array}{c} 0.34 \\ 0.38 \\ 0.48 \\ 0.76 \\ 0.54 \\ 0.45 \\ 0.72 \\ 0.71 \\ 0.61 \end{array}$	Figure 16 Figure 19 Figure 22 Figure 25 Figure 28 Figure 31 Figure 34 Figure 37	KAT01 LOD99 MER02GRK MER04 MER99MU PAL04T2 PAL04T5	$\begin{array}{c} 0.32 \\ 0.37 \\ 0.48 \\ 0.46 \\ 0.31 \\ 0.21 \\ 0.25 \\ 0.65 \end{array}$	Figure 17 Figure 20 Figure 23 Figure 26 Figure 29 Figure 32 Figure 35	LAG09CE LU10 MER02LS1 MER99CR PAL04MT PAL04T3 PAL06	$\begin{array}{c} 0.49\\ 0.19\\ 0.67\\ 0.51\\ 0.46\\ 0.64\\ 0.29\\ 0.57\end{array}$	Figure 18 Figure 21 Figure 24 Figure 27 Figure 30 Figure 33 Figure 36

Table 1: The R^2 and figure number for each heuristic's CART model predicting instance-specific performance, as described in Section 5.1.

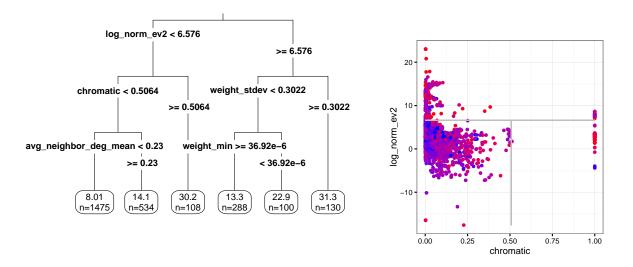


Figure 1: A CART model identifying instances on which ALK98 performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

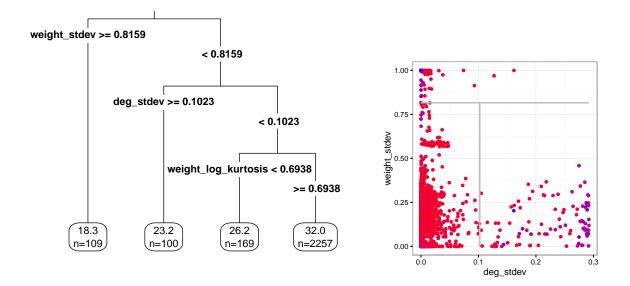


Figure 2: A CART model identifying instances on which BEA98SA performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

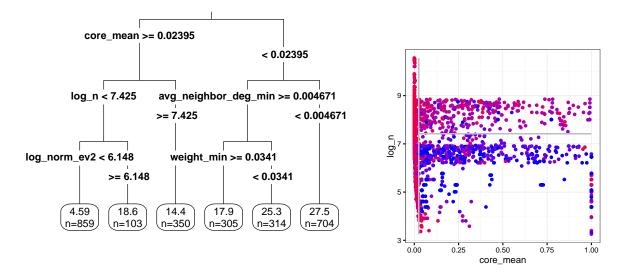


Figure 3: A CART model identifying instances on which BEA98TS performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

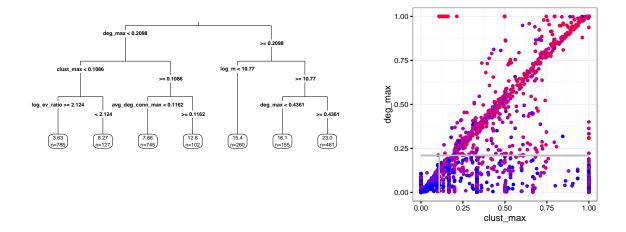


Figure 4: A CART model identifying instances on which BUR02 performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

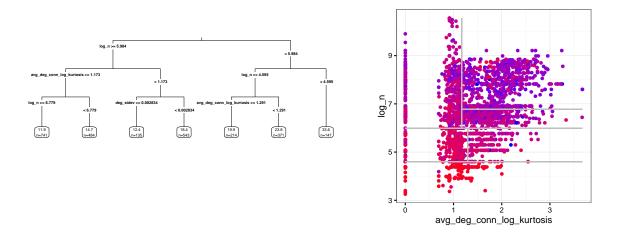


Figure 5: A CART model identifying instances on which DUA05 performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

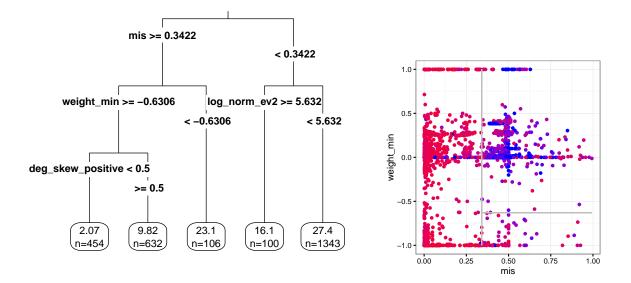


Figure 6: A CART model identifying instances on which FES02G performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

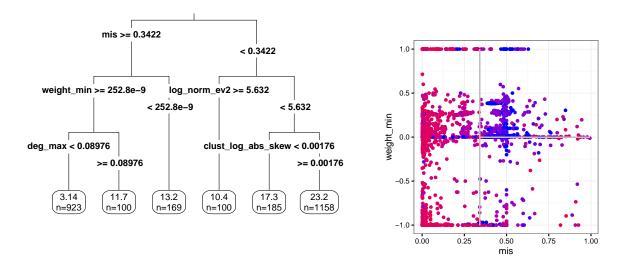


Figure 7: A CART model identifying instances on which FES02GP performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

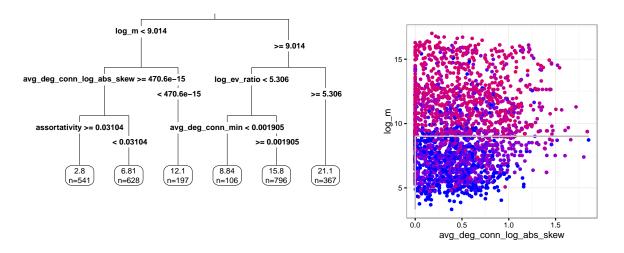


Figure 8: A CART model identifying instances on which FES02GV performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

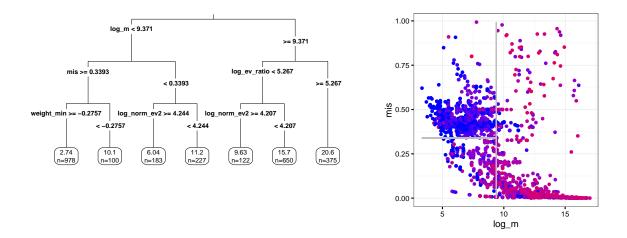


Figure 9: A CART model identifying instances on which FES02GVP performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

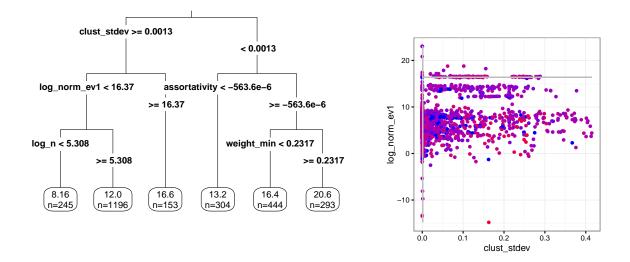


Figure 10: A CART model identifying instances on which FES02V performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

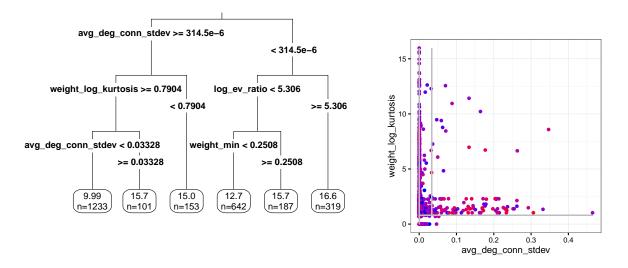


Figure 11: A CART model identifying instances on which FES02VP performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

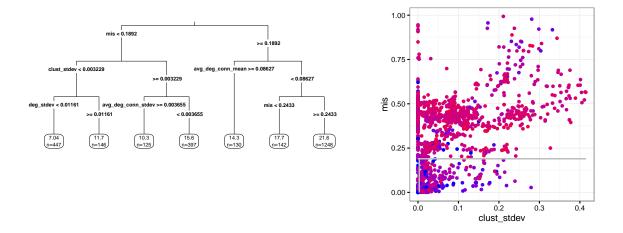


Figure 12: A CART model identifying instances on which GLO10 performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

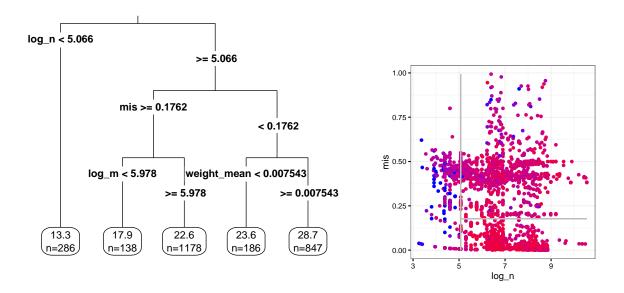


Figure 13: A CART model identifying instances on which GLO98 performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

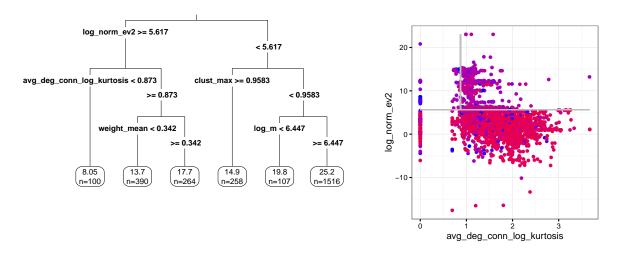


Figure 14: A CART model identifying instances on which HAS00GA performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

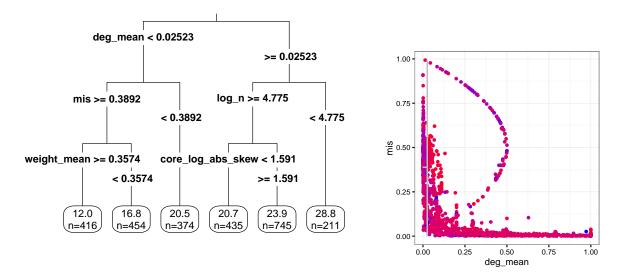


Figure 15: A CART model identifying instances on which HAS00TS performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

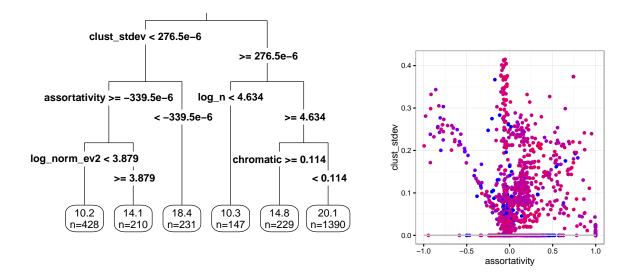


Figure 16: A CART model identifying instances on which KAT00 performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

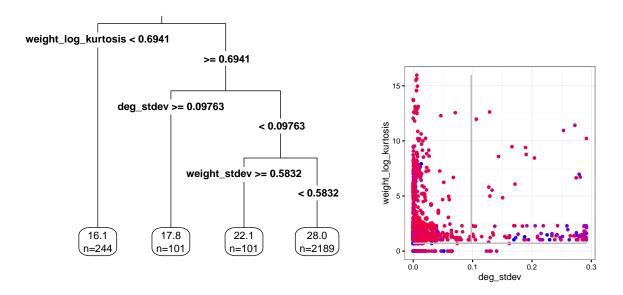


Figure 17: A CART model identifying instances on which KAT01 performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

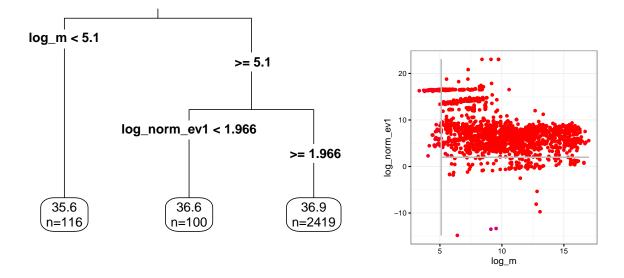


Figure 18: A CART model identifying instances on which LAG09CE performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

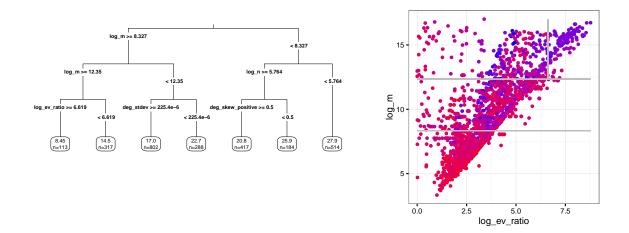


Figure 19: A CART model identifying instances on which LAG09HCE performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

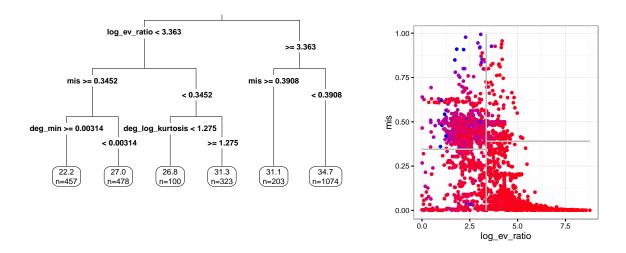


Figure 20: A CART model identifying instances on which LOD99 performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

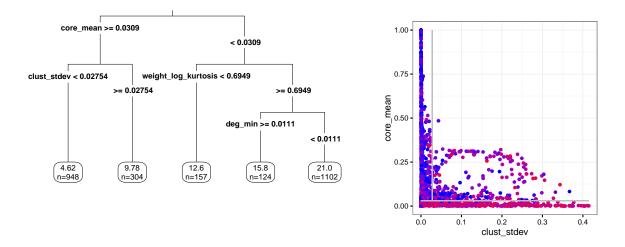


Figure 21: A CART model identifying instances on which LU10 performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

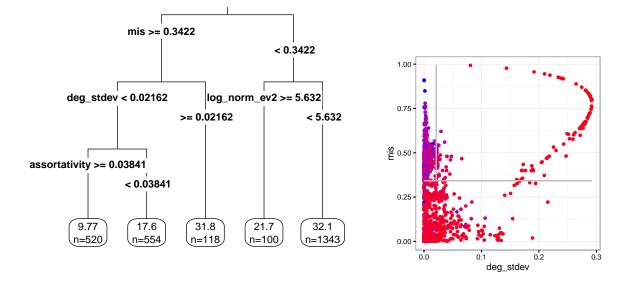


Figure 22: A CART model identifying instances on which MER02GR performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

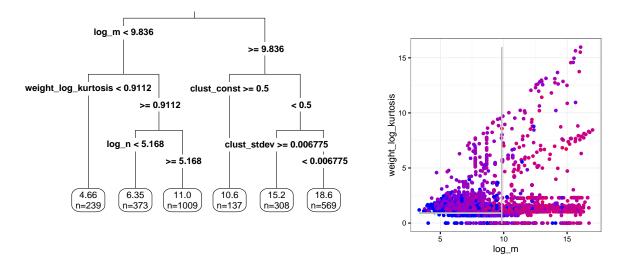


Figure 23: A CART model identifying instances on which MER02GRK performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

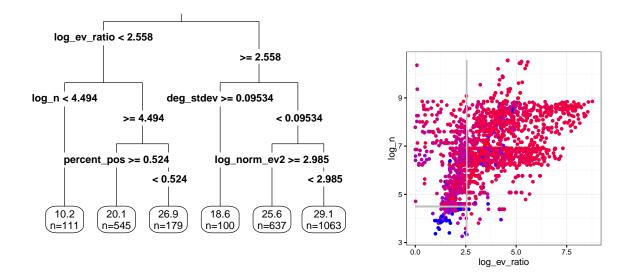


Figure 24: A CART model identifying instances on which MER02LS1 performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

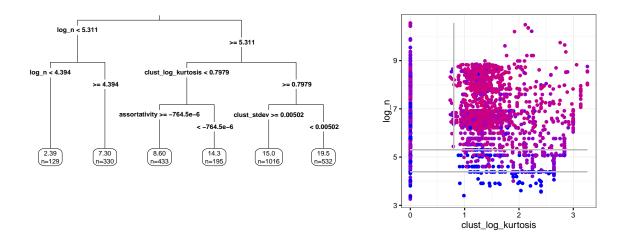


Figure 25: A CART model identifying instances on which MER02LSK performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

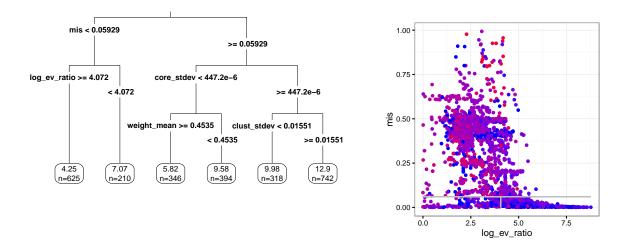


Figure 26: A CART model identifying instances on which MER04 performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

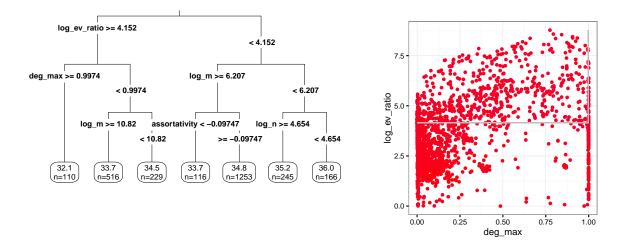


Figure 27: A CART model identifying instances on which MER99CR performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

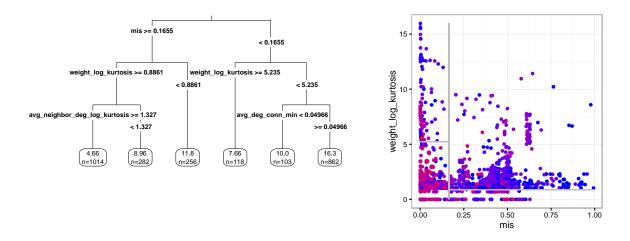


Figure 28: A CART model identifying instances on which MER99LS performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

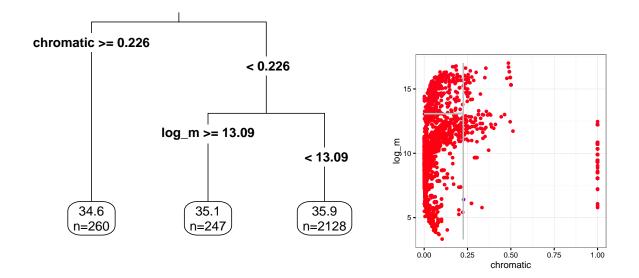


Figure 29: A CART model identifying instances on which MER99MU performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

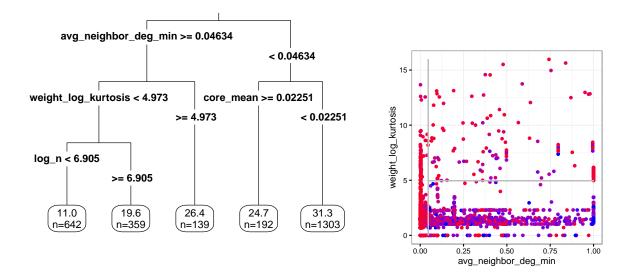


Figure 30: A CART model identifying instances on which PAL04MT performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

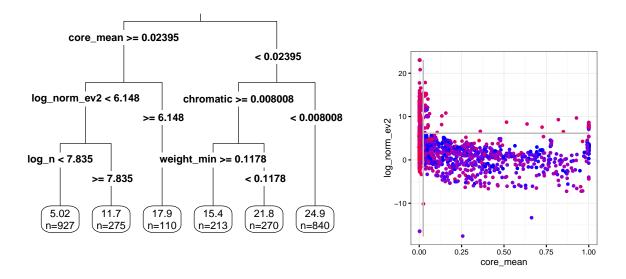


Figure 31: A CART model identifying instances on which PAL04T1 performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

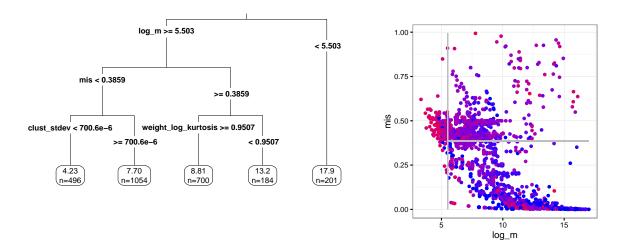


Figure 32: A CART model identifying instances on which PAL04T2 performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

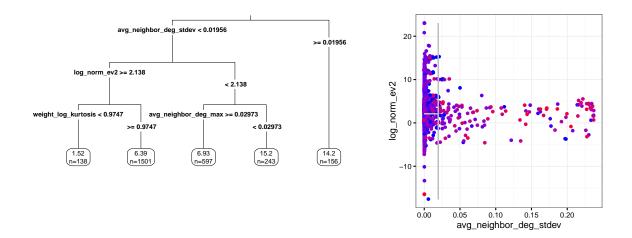


Figure 33: A CART model identifying instances on which PAL04T3 performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

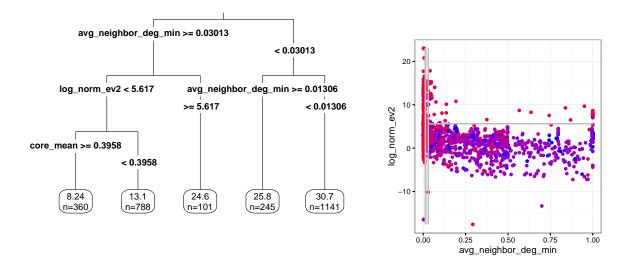


Figure 34: A CART model identifying instances on which PAL04T4 performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

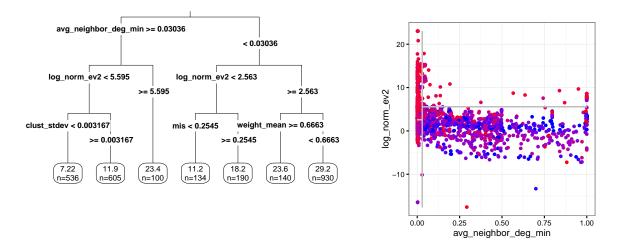


Figure 35: A CART model identifying instances on which PAL04T5 performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

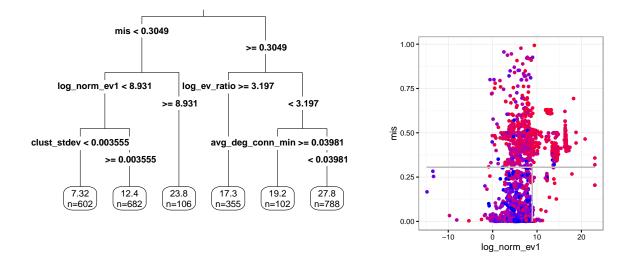


Figure 36: A CART model identifying instances on which PAL06 performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).

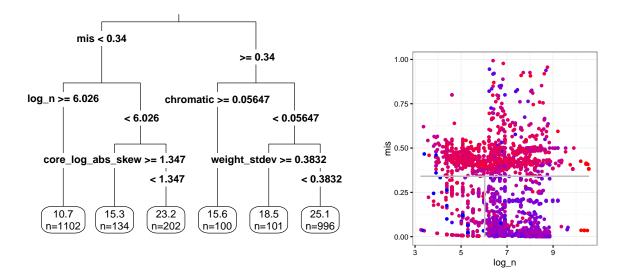


Figure 37: A CART model identifying instances on which PAR08 performs particularly well or poorly. Blue indicates the heuristic performed well (rank near 1) and red indicates the heuristic performed poorly (rank near 37).