

Parallel Hybrid Best-First Search

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Abstract

Supplementary materials for the article *Parallel Hybrid Best-First Search* published at the 28th International Conference on Principles and Practice of Constraint Programming (CP-2022). Figures 1, 2 and Tables 1, 2 (without the experimental results on 1,800 cores) are also in the article.

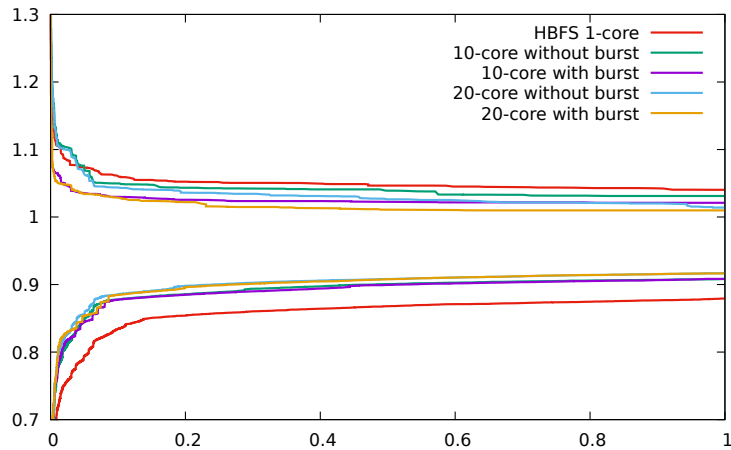


Figure 1: Comparison on a medium-scale computer between sequential versus parallel HBFS with or without burst mode. The x-axis represents normalized time (with 1 corresponding to 3,600 seconds). The y-axis corresponds to normalized lower and upper bounds on 134 instances (with 1 corresponding to the optimum or best known cost).

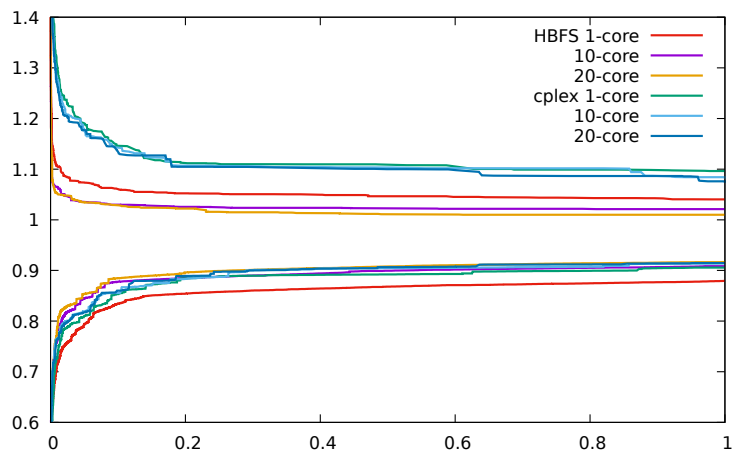


Figure 2: Comparison on a medium-scale computer between toulbar2 using parallel HBFS (with burst mode) and cplex using multiple threads. The x-axis represents normalized time (with 1 corresponding to 3,600 seconds). The y-axis corresponds to normalized lower and upper bounds on 134 instances (with 1 corresponding to the optimum or best known cost).

Method	CPD (35)		Warehouses (15)		Linkage (22)		MaxClique (62)	
		<i>Speed-up</i>		<i>Speed-up</i>		<i>Speed-up</i>		<i>Speed-up</i>
HBFS-1	30 (43.44s)		15 (128.96s)		20 (23.24s)		37 (364.25s)	
HBFS-10	30 (8s)	<i>5.43</i>	15 (80.174s)	<i>1.61</i>	21 (3.5s)	<i>6.64</i>	38 (40.24s)	<i>9.05</i>
HBFS-20	30 (4.43s)	<i>9.81</i>	15 (85.39s)	<i>1.51</i>	21 (2s)	<i>11.62</i>	40 (19.9s)	<i>18.3</i>
cplex-1	24 (331.2s)		15 (123.83s)		22 (8.04s)		42 (282.16s)	
cplex-10	24 (226.51s)	<i>1.46</i>	15 (68.82s)	<i>1.8</i>	22 (2.56s)	<i>3.14</i>	45 (55.48s)	<i>5.08</i>
cplex-20	24 (198.49s)	<i>1.67</i>	15 (72.06s)	<i>1.72</i>	22 (2.29s)	<i>3.51</i>	46 (71.47s)	<i>3.95</i>
HBFS-1 (cluster)	30 (66.46s)		15 (392.30s)		21 (427.21s)		37 (504s)	
HBFS-180 (cluster)	30 (3.7s)	17.96	15 (126s)	3.11	22 (4.15s)	102.94	45 (6.44s)	78.26

Table 1: Number of solved instances within 1 hour (except for sequential HBFS-1 run on the cluster with a larger timeout of 10 hours) and average time in seconds in parentheses. To compute the mean we only consider for a given method (toulbar2 HBFS or cplex) the instances solved with any number of cores on the same computer (server with 3 GHz cores or cluster with 2.3 GHz cores).

instance	n	d	opt.	<i>cub</i>	$ l $	av. time	max. time	#fail (depth)	EPS-180	HBFS-180	HBFS-1800
linkage/pedigree19	259	5	4625	5684	5114	20.57	-	1 (4)	-	69.1	201
linkage/pedigree40	274	6	7300	8838	5641	101.99	-	49 (21)	-	1680	2753
linkage/pedigree51	295	5	6406	6802	5798	0.61	497.38	0	499	5.7	8.4
cpd/1BRS	38	178	4007610	4007679	956	2.94	38.90	0	44	37.5	15.2
cpd/1CDL	38	170	3590514	3590825	1001	6.66	79.04	0	79	18.3	14.9
cpd/1GVP	52	170	5196719	5196841	979	14.59	170.66	0	171	17.0	24.1
maxclique/brock400_1	400	2	373	379	6010	63.95	-	12 (149)	-	1812	947
maxclique/brock400_2	400	2	371	379	5975	65.27	-	18 (149)	-	880	686
maxclique/san400_0.5_1	400	2	387	392	6073	5.07	414.96	0	3652	1220	630

Table 2: EPS, HBFS-180 and HBFS-1800 results on hard instances. A ‘-’ indicates that some (see #failed) subproblems could not be solved in less than 3,600 seconds.

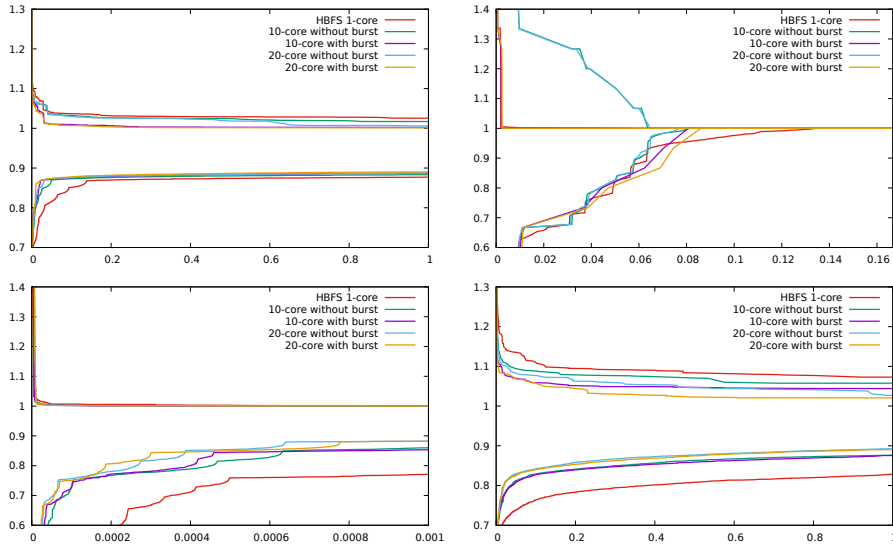


Figure 3: Comparison on a medium-scale computer between sequential versus parallel HBFS with or without burst mode. The x-axis represents normalized time (with 1 corresponding to 3,600 seconds). The y-axis corresponds to normalized lower and upper bounds on (Upper-Left) 35 CPD, (Upper-Right) 15 Warehouses, (Lower-Left) 22 Linkage, (Lower-Right) 62 MaxClique instances (with 1 corresponding to the optimum or best known cost).

Instance	n	d	HBFS-1	HBFS-10	HBFS-20	Speed-10	Speed-20
1BK2	22	145	0.038(48)	0.042(67)	0.057(67)	0.904	0.666
1BRS	38	178	337.439(154898)	66.793(210774)	32.975(181989)	5.052	10.23
1C9O	35	177	0.236(566)	0.214(601)	0.236(878)	1.102	1.0
1CDL	38	170	232.863(70451)	59.952(121263)	38.367(127756)	3.884	6.069
1CM1	42	167	1.249(304)	0.893(391)	0.931(387)	1.398	1.341
1CSE	40	114	0.011(16)	0.020(16)	0.030(16)	0.55	0.366
1CSK	18	41	0.011(39)	0.016(42)	0.016(42)	0.687	0.687
1CSP	14	142	0.180(798)	0.124(1080)	0.134(1202)	1.451	1.343
1CTF	36	43	0.160(974)	0.086(1532)	0.100(2171)	1.860	1.6
1DKT	45	174	0.276(355)	0.295(466)	0.317(575)	0.935	0.870
1ENH	36	156	-	-	-	-	-
1FNA	29	45	0.079(449)	0.048(701)	0.064(1063)	1.645	1.234
1FYN	21	183	0.353(106)	0.393(223)	0.408(200)	0.898	0.865
1GVP	52	170	497.121(193685)	77.808(211554)	34.656(161096)	6.389	14.34
1HNG	57	168	0.427(1646)	0.319(1433)	0.344(2192)	1.338	1.241
1L63	73	175	0.114(199)	0.129(216)	0.147(216)	0.883	0.775
1LZ1	53	43	0.720(5128)	0.171(5315)	0.146(5551)	4.210	4.931
1MJC	5	136	0.004(2)	0.021(2)	0.025(2)	0.190	0.16
1NXB	25	35	0.007(17)	0.014(17)	0.022(17)	0.5	0.318
1PGB	31	179	-	-	-	-	-
1PIN	26	185	0.832(992)	0.502(1187)	0.512(1772)	1.657	1.625
1POH	31	168	0.023(39)	0.028(35)	0.043(35)	0.821	0.534
1RIS	55	165	63.632(25676)	13.198(39604)	10.677(56152)	4.821	5.959
1SHF	20	47	0.013(16)	0.020(16)	0.037(16)	0.65	0.351
1SHG	18	50	0.043(536)	0.024(883)	0.031(1169)	1.791	1.387
1STN	120	180	-	-	-	-	-
1TEN	21	43	0.011(109)	0.017(101)	0.025(101)	0.647	0.44
1UBI	35	141	0.869(3687)	0.248(7492)	0.203(6723)	3.504	4.280
2CI2	48	180	-	-	-	-	-
2DRI	34	179	117.015(131753)	13.057(126009)	8.369(152847)	8.961	13.98
2PCY	32	44	0.019(39)	0.026(34)	0.041(34)	0.730	0.463
2RN2	52	43	0.111(272)	0.109(367)	0.109(412)	1.018	1.018
2TRX	56	179	0.151(328)	0.157(310)	0.175(295)	0.961	0.862
3CHY	66	56	49.168(82898)	5.157(74429)	3.891(111411)	9.534	12.63
3HHR	115	175	-	-	-	-	-

Table 3: CPD benchmark solving time in seconds (number of nodes in parentheses) and speed-up for sequential versus parallel HBFS (with burst mode) in toulbar2. '-': unsolved in 1h. Experiments were made on a medium-scale computer with cores running at 3 GHz.

Instance	n	d	HBFS-1	HBFS-10	HBFS-20	Speed-10	Speed-20
capmo1	200	100	6.210(7450)	2.176(8182)	2.253(11381)	2.853	2.756
capmo2	200	100	1.807(3545)	1.307(4571)	1.318(5144)	1.382	1.371
capmo3	200	100	5.115(5548)	2.570(6414)	2.737(7556)	1.990	1.868
capmo4	200	100	1.548(2219)	1.144(2607)	1.177(2842)	1.353	1.315
capmo5	200	100	1.178(2244)	0.907(2347)	0.939(2576)	1.298	1.254
capmp1	400	200	76.565(22294)	36.440(24755)	39.058(29549)	2.101	1.960
capmp2	400	200	31.269(14218)	20.458(15449)	20.909(18265)	1.528	1.495
capmp3	400	200	33.761(14935)	22.065(16270)	22.236(17997)	1.530	1.518
capmp4	400	200	60.784(18909)	39.804(20573)	40.555(22812)	1.527	1.498
capmp5	400	200	22.758(13788)	15.436(15183)	15.614(17100)	1.474	1.457
capmq1	600	300	234.527(41558)	159.795(46376)	169.543(50447)	1.467	1.383
capmq2	600	300	376.344(47832)	253.176(62399)	268.144(64573)	1.486	1.403
capmq3	600	300	198.975(39463)	132.376(41554)	138.671(46572)	1.503	1.434
capmq4	600	300	399.384(45392)	224.407(52846)	248.021(58262)	1.779	1.610
capmq5	600	300	484.131(45824)	290.551(55870)	309.584(68062)	1.666	1.563

Table 4: Warehouses benchmark solving time in seconds (number of nodes in parentheses) and speed-up for sequential versus parallel HBFS (with burst mode) in toulbar2. '-': unsolved in 1h. Experiments were made on a medium-scale computer with cores running at 3 GHz.

Instance	n	d	HBFS-1	HBFS-10	HBFS-20	Speed-10	Speed-20
pedigree13	274	3	9.728(155015)	1.510(202376)	1.081(313231)	6.442	8.999
pedigree18	288	5	0.875(10672)	0.116(14467)	0.086(23056)	7.543	10.17
pedigree19	259	5	-	1595.811(226667769)	715.888(216864808)	-	-
pedigree1	80	4	0.011(184)	0.018(572)	0.020(795)	0.611	0.55
pedigree20	115	5	0.194(5273)	0.051(7804)	0.043(9426)	3.803	4.511
pedigree23	83	5	0.028(659)	0.017(809)	0.025(879)	1.647	1.12
pedigree25	169	5	0.108(2934)	0.041(7242)	0.038(9474)	2.634	2.842
pedigree30	296	5	1.204(15209)	0.137(20579)	0.092(29184)	8.788	13.08
pedigree31	261	4	1.797(32405)	0.375(54345)	0.254(74297)	4.792	7.074
pedigree33	176	4	0.077(1578)	0.024(2179)	0.034(2396)	3.208	2.264
pedigree34	224	4	0.306(6630)	0.083(13778)	0.064(17345)	3.686	4.781
pedigree37	143	4	0.029(494)	0.020(1032)	0.045(1407)	1.45	0.644
pedigree38	156	5	0.170(4356)	0.053(8548)	0.038(10740)	3.207	4.473
pedigree39	161	4	0.036(812)	0.021(2391)	0.025(2198)	1.714	1.44
pedigree40	274	6	-	-	-	-	-
pedigree41	230	5	31.893(512625)	5.620(745619)	2.795(807495)	5.674	11.41
pedigree42	123	5	0.062(1556)	0.026(2923)	0.025(3529)	2.384	2.48
pedigree44	212	4	13.549(220064)	1.650(230637)	0.672(209425)	8.211	20.16
pedigree50	129	6	0.429(11124)	0.087(15525)	0.054(17360)	4.931	7.944
pedigree51	295	5	401.881(6133198)	60.016(7803526)	34.320(9420126)	6.696	11.70
pedigree7	244	4	0.876(16205)	0.129(21818)	0.099(33103)	6.790	8.848
pedigree9	232	4	1.490(24462)	0.283(38086)	0.209(59311)	5.265	7.129

Table 5: Linkage benchmark solving time in seconds (number of nodes in parentheses) and speed-up for sequential versus parallel HBFS (with burst mode) in toulbar2. '-': unsolved in 1h. Experiments were made on a medium-scale computer with cores running at 3 GHz.

Instance	n	d	HBFS-1	HBFS-10	HBFS-20	Speed-10	Speed-20
brock200_1	200	2	138.485(6629072)	16.674(6368892)	7.543(5824793)	8.305	18.35
brock200_2	200	2	3.202(111981)	0.659(159608)	0.678(209486)	4.858	4.722
brock200_3	200	2	9.466(370784)	1.273(407930)	0.926(487573)	7.435	10.22
brock200_4	200	2	26.018(1127989)	3.429(1186235)	1.630(1041930)	7.587	15.96
brock400_1	400	2	-	-	-	-	-
brock400_2	400	2	-	-	-	-	-
brock400_3	400	2	-	-	-	-	-
brock400_4	400	2	-	-	2685.064(897034280)	-	-
brock800_1	800	2	-	-	-	-	-
brock800_2	800	2	-	-	-	-	-
brock800_3	800	2	-	-	-	-	-
brock800_4	800	2	-	-	-	-	-
c-fat200-1	200	2	0.225(475)	0.254(630)	0.303(665)	0.885	0.742
c-fat200-2	200	2	0.197(467)	0.250(840)	0.336(981)	0.788	0.586
c-fat200-5	200	2	0.115(499)	0.141(1407)	0.220(2110)	0.815	0.522
c-fat500-10	500	2	2.337(1599)	2.201(4566)	2.836(6458)	1.061	0.824
c-fat500-1	500	2	5.563(1065)	5.354(1250)	5.727(1320)	1.039	0.971
c-fat500-2	500	2	5.017(1197)	4.712(1846)	5.096(2156)	1.064	0.984
c-fat500-5	500	2	4.071(1588)	3.510(3654)	4.330(5263)	1.159	0.940
hamming10-2	1024	2	0.037(256)	0.060(256)	0.059(256)	0.616	0.627
hamming10-4	1024	2	-	-	-	-	-
hamming6-2	64	2	0.001(16)	0.022(16)	0.736(16)	0.045	0.001
hamming6-4	64	2	0.024(1731)	0.014(1874)	0.025(1872)	1.714	0.96
hamming8-2	256	2	0.006(64)	0.739(64)	0.013(64)	0.008	0.461
hamming8-4	256	2	61.834(2225278)	6.811(1922339)	3.403(1695882)	9.078	18.17
johnson16-2-4	120	2	47.482(4446093)	5.684(4264346)	2.794(4372450)	8.353	16.99
johnson32-2-4	496	2	-	-	-	-	-
johnson8-2-4	28	2	0.003(310)	0.003(319)	0.009(344)	1.0	0.333
johnson8-4-4	70	2	0.062(4360)	0.017(5304)	0.027(5825)	3.647	2.296
keller4	171	2	13.965(865323)	1.833(880465)	0.854(830158)	7.618	16.35
keller5	776	2	-	-	-	-	-
MANN_a27	378	2	1.862(101564)	0.113(39411)	0.073(33430)	16.47	25.50
MANN_a45	1035	2	1268.360(51000545)	94.127(31089322)	35.951(24192525)	13.47	35.28
MANN_a81	3321	2	-	-	-	-	-
MANN_a9	45	2	0.001(48)	0.012(45)	0.012(45)	0.083	0.083
p_hat1000-1	1000	2	534.817(4320505)	162.431(6030224)	64.857(4834827)	3.292	8.246
p_hat1000-2	1000	2	-	-	-	-	-
p_hat1000-3	1000	2	-	-	-	-	-
p_hat300-1	300	2	3.345(52496)	1.022(60106)	0.872(55076)	3.272	3.836
p_hat300-2	300	2	14.448(404290)	1.680(249567)	1.127(229423)	8.6	12.81
p_hat300-3	300	2	3271.164(98363142)	248.686(64359457)	77.053(38258155)	13.15	42.45
p_hat500-1	500	2	32.377(340431)	6.042(294509)	5.019(307260)	5.358	6.450
p_hat500-2	500	2	1591.568(24781134)	222.485(23875099)	134.999(25756543)	7.153	11.78
p_hat500-3	500	2	-	-	-	-	-
p_hat700-1	700	2	137.259(1105721)	40.209(1244364)	19.056(965954)	3.413	7.202
p_hat700-2	700	2	-	-	-	-	-
p_hat700-3	700	2	-	-	-	-	-
san1000	1000	2	-	-	-	-	-
san200_0.7_1	200	2	229.142(17257759)	90.847(63189008)	24.220(33634154)	2.522	9.460
san200_0.7_2	200	2	-	-	-	-	-
san200_0.9_1	200	2	0.262(6698)	0.042(6482)	0.041(9639)	6.238	6.390
san200_0.9_2	200	2	6.948(203789)	0.711(174967)	0.288(135340)	9.772	24.12
san200_0.9_3	200	2	1936.883(86332248)	177.737(62093525)	87.931(64906983)	10.89	22.02
san400_0.5_1	400	2	-	-	-	-	-
san400_0.7_1	400	2	-	-	-	-	-
san400_0.7_2	400	2	-	-	-	-	-
san400_0.7_3	400	2	-	-	-	-	-
san400_0.9_1	400	2	-	3495.865(454884726)	1935.818(517806883)	-	-
sanr200_0.7	200	2	47.497(2094971)	6.266(2296979)	3.058(2143047)	7.580	15.53
sanr200_0.9	200	2	3593.205(155684986)	334.728(116112217)	214.218(160719451)	10.73	16.77
sanr400_0.5	400	2	490.192(8894646)	48.308(6129795)	30.322(7233212)	10.14	16.16
sanr400_0.7	400	2	-	-	3200.752(1132310915)	-	-

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Table 6: MaxClique benchmark solving time in seconds (number of nodes in parentheses) and speed-up for sequential versus parallel HBFS (with burst mode) in toulbar2. '-': unsolved in 1h. Experiments were made on a medium-scale computer with cores running at 3 GHz.

Instance	n	d	cplex-1	cplex-10	cplex-20	Speed-10	Speed-20
1BK2	22	145	41.87(0)	44.80(0)	44.15(0)	0.934	0.948
1BRS	38	178	-	-	-	-	-
1C9O	35	177	229.57(0)	255.60(0)	234.34(0)	0.898	0.979
1CDL	38	170	-	-	-	-	-
1CM1	42	167	3150.68(5)	-	-	-	-
1CSE	40	114	72.00(0)	77.69(0)	95.57(0)	0.926	0.753
1CSK	18	41	5.54(0)	6.11(0)	6.05(0)	0.906	0.915
1CSP	14	142	390.45(438)	74.86(159)	95.06(560)	5.215	4.107
1CTF	36	43	102.99(69)	115.49(17)	118.84(73)	0.891	0.866
1DKT	45	174	322.04(0)	377.40(0)	417.18(0)	0.853	0.771
1ENH	36	156	-	-	-	-	-
1FNA	29	45	36.26(0)	51.97(0)	58.22(0)	0.697	0.622
1FYN	21	183	396.56(0)	541.57(0)	441.46(0)	0.732	0.898
1GVP	52	170	-	-	-	-	-
1HNG	57	168	689.69(1)	946.05(1)	868.50(3)	0.729	0.794
1L63	73	175	506.80(0)	636.52(0)	665.37(0)	0.796	0.761
1LZ1	53	43	316.41(674)	241.49(610)	270.29(304)	1.310	1.170
1MJC	5	136	1.39(0)	1.76(0)	1.84(0)	0.789	0.755
1NXB	25	35	6.37(0)	8.43(0)	8.53(0)	0.755	0.746
1PGB	31	179	-	-	-	-	-
1PIN	26	185	3433.63(2353)	1038.07(1887)	429.90(47)	3.307	7.987
1POH	31	168	11.97(0)	16.66(0)	17.05(0)	0.718	0.702
1RIS	55	165	-	-	-	-	-
1SHF	20	47	3.69(0)	4.85(0)	4.92(0)	0.760	0.75
1SHG	18	50	13.97(54)	13.72(138)	14.94(25)	1.018	0.935
1STN	120	180	-	-	-	-	-
1TEN	21	43	10.93(0)	12.95(0)	12.93(0)	0.844	0.845
1UBI	35	141	641.35(241)	296.49(251)	273.56(239)	2.163	2.344
2CI2	48	180	-	-	-	-	-
2DRI	34	179	-	-	-	-	-
2PCY	32	44	20.26(0)	26.85(0)	27.76(0)	0.754	0.729
2RN2	52	43	151.51(0)	201.27(0)	246.72(0)	0.752	0.614
2TRX	56	179	212.50(0)	219.26(0)	212.13(0)	0.969	1.001
3CHY	66	56	-	2947.51(7263)	3077.19(7059)	-	-
3HHR	115	175	-	-	-	-	-

Table 7: CPD benchmark solving time in seconds (number of nodes in parentheses) and speed-up for cplex solver with 1, 10, or 20 threads. '-': unsolved in 1h. Experiments were made on a medium-scale computer with cores running at 3 GHz.

Instance	n	d	cplex-1	cplex-10	cplex-20	Speed-10	Speed-20
capmo1	200	100	11.92(150)	6.51(161)	6.19(209)	1.831	1.925
capmo2	200	100	2.52(29)	2.70(25)	2.86(25)	0.933	0.881
capmo3	200	100	13.76(99)	7.38(91)	8.12(87)	1.864	1.694
capmo4	200	100	2.59(19)	2.84(23)	2.99(23)	0.911	0.866
capmo5	200	100	2.27(28)	2.77(29)	2.92(29)	0.819	0.777
capmp1	400	200	69.32(85)	47.52(107)	59.49(97)	1.458	1.165
capmp2	400	200	27.27(31)	24.40(31)	25.73(33)	1.117	1.059
capmp3	400	200	54.86(47)	42.85(41)	46.37(41)	1.280	1.183
capmp4	400	200	74.56(65)	61.64(69)	64.59(69)	1.209	1.154
capmp5	400	200	30.03(33)	21.72(29)	23.23(29)	1.382	1.292
capmq1	600	300	186.56(67)	132.70(67)	148.43(67)	1.405	1.256
capmq2	600	300	314.25(113)	141.38(121)	139.76(117)	2.222	2.248
capmq3	600	300	143.84(37)	77.74(37)	86.68(37)	1.850	1.659
capmq4	600	300	350.82(81)	201.17(83)	207.21(83)	1.743	1.693
capmq5	600	300	572.89(157)	258.99(185)	256.29(177)	2.212	2.235

Table 8: Warehouses benchmark solving time in seconds (number of nodes in parentheses) and speed-up for cplex solver with 1, 10, or 20 threads. '-': unsolved in 1h. Experiments were made on a medium-scale computer with cores running at 3 GHz.

Instance	n	d	cplex-1	cplex-10	cplex-20	Speed-10	Speed-20
pedigree13	274	3	0.90(191)	0.57(0)	0.54(0)	1.578	1.666
pedigree18	288	5	1.90(572)	1.00(334)	1.08(315)	1.9	1.759
pedigree19	259	5	56.62(7136)	16.88(13084)	12.41(13674)	3.354	4.562
pedigree1	80	4	0.17(0)	0.17(0)	0.37(0)	1.0	0.459
pedigree20	115	5	0.89(505)	0.46(217)	0.62(0)	1.934	1.435
pedigree23	83	5	0.21(0)	0.18(0)	0.39(0)	1.166	0.538
pedigree25	169	5	1.59(1021)	0.68(489)	0.80(366)	2.338	1.987
pedigree30	296	5	1.09(166)	1.08(263)	1.32(257)	1.009	0.825
pedigree31	261	4	7.55(1637)	4.16(3509)	2.72(2361)	1.814	2.775
pedigree33	176	4	1.07(702)	0.55(881)	0.63(1034)	1.945	1.698
pedigree34	224	4	0.96(149)	0.59(0)	0.59(0)	1.627	1.627
pedigree37	143	4	0.56(85)	0.54(23)	0.74(32)	1.037	0.756
pedigree38	156	5	0.46(0)	0.44(0)	0.46(0)	1.045	1.0
pedigree39	161	4	0.51(56)	0.35(0)	0.41(0)	1.457	1.243
pedigree40	274	6	86.24(8724)	22.05(13031)	20.22(20813)	3.911	4.265
pedigree41	230	5	4.02(1005)	1.30(644)	1.31(588)	3.092	3.068
pedigree42	123	5	0.29(0)	0.29(0)	0.28(0)	1.0	1.035
pedigree44	212	4	1.62(716)	0.89(992)	1.04(1377)	1.820	1.557
pedigree50	129	6	1.81(654)	0.96(810)	1.08(816)	1.885	1.675
pedigree51	295	5	6.61(2457)	1.54(1348)	1.62(1731)	4.292	4.080
pedigree7	244	4	0.63(141)	0.62(0)	0.65(0)	1.016	0.969
pedigree9	232	4	1.30(264)	0.97(138)	1.14(194)	1.340	1.140

Table 9: Linkage benchmark solving time in seconds (number of nodes in parentheses) and speed-up for cplex solver with 1, 10, or 20 threads. '-': unsolved in 1h. Experiments were made on a medium-scale computer with cores running at 3 GHz.

Instance	n	d	cplex-1	cplex-10	cplex-20	Speed-10	Speed-20
brock200_1	200	2	694.09(276512)	113.87(303894)	39.35(152336)	6.095	17.63
brock200_2	200	2	57.82(9706)	20.88(9614)	9.31(5440)	2.769	6.210
brock200_3	200	2	224.39(56667)	32.54(47830)	18.92(24776)	6.895	11.85
brock200_4	200	2	185.73(54521)	36.02(76408)	24.40(54378)	5.156	7.611
brock400_1	400	2	-	-	-	-	-
brock400_2	400	2	-	-	-	-	-
brock400_3	400	2	-	-	-	-	-
brock400_4	400	2	-	-	-	-	-
brock800_1	800	2	-	-	-	-	-
brock800_2	800	2	-	-	-	-	-
brock800_3	800	2	-	-	-	-	-
brock800_4	800	2	-	-	-	-	-
c-fat200-1	200	2	6.60(0)	6.46(0)	6.44(0)	1.021	1.024
c-fat200-2	200	2	5.30(0)	5.29(0)	5.19(0)	1.001	1.021
c-fat200-5	200	2	5.01(5)	2.29(0)	2.26(0)	2.187	2.216
c-fat500-10	500	2	3.64(0)	3.64(0)	2.99(0)	1.0	1.217
c-fat500-1	500	2	1.92(0)	2.52(0)	2.44(0)	0.761	0.786
c-fat500-2	500	2	3.99(0)	2.88(0)	2.65(0)	1.385	1.505
c-fat500-5	500	2	4.82(0)	4.50(0)	2.88(0)	1.071	1.673
hamming10-2	1024	2	0.06(0)	0.09(0)	0.10(0)	0.666	0.6
hamming10-4	1024	2	-	-	-	-	-
hamming6-2	64	2	0.00(0)	0.01(0)	0.01(0)	0.0	0.0
hamming6-4	64	2	0.08(33)	0.08(0)	0.22(0)	1.0	0.363
hamming8-2	256	2	0.01(0)	0.03(0)	0.03(0)	0.333	0.333
hamming8-4	256	2	0.69(0)	0.26(0)	0.26(0)	2.653	2.653
johnson16-2-4	120	2	0.00(0)	0.02(0)	0.01(0)	0.0	0.0
johnson32-2-4	496	2	0.02(0)	0.03(0)	0.04(0)	0.666	0.5
johnson8-2-4	28	2	0.00(0)	0.01(0)	0.01(0)	0.0	0.0
johnson8-4-4	70	2	0.00(0)	0.01(0)	0.01(0)	0.0	0.0
keller4	171	2	17.04(4879)	1.96(4039)	1.76(3479)	8.693	9.681
keller5	776	2	-	-	-	-	-
MANN_a27	378	2	0.47(26)	0.31(38)	0.37(0)	1.516	1.270
MANN_a45	1035	2	28.42(31739)	1.51(7080)	9.26(58969)	18.82	3.069
MANN_a81	3321	2	2779.71(571243)	804.89(1453615)	1514.51(5980343)	3.453	1.835
MANN_a9	45	2	0.01(5)	0.02(0)	0.20(0)	0.5	0.05
p_hat1000-1	1000	2	-	-	3213.79(1222054)	-	-
p_hat1000-2	1000	2	-	-	-	-	-
p_hat1000-3	1000	2	-	-	-	-	-
p_hat300-1	300	2	237.06(4074)	23.33(0)	23.76(0)	10.16	9.977
p_hat300-2	300	2	160.25(6167)	36.58(3177)	31.71(2805)	4.380	5.053
p_hat300-3	300	2	-	435.40(280191)	167.37(134542)	-	-
p_hat500-1	500	2	824.86(67226)	119.48(34595)	117.82(52937)	6.903	7.001
p_hat500-2	500	2	-	453.21(95388)	152.69(77991)	-	-
p_hat500-3	500	2	-	-	-	-	-
p_hat700-1	700	2	3166.67(155906)	553.44(83394)	322.35(139485)	5.721	9.823
p_hat700-2	700	2	-	-	-	-	-
p_hat700-3	700	2	-	-	-	-	-
san1000	1000	2	1444.64(5498)	305.00(14121)	604.09(43928)	4.736	2.391
san200_0.7_1	200	2	0.14(0)	0.15(0)	0.15(0)	0.933	0.933
san200_0.7_2	200	2	1.22(30)	0.42(0)	0.58(0)	2.904	2.103
san200_0.9_1	200	2	0.02(0)	0.04(0)	0.04(0)	0.5	0.5
san200_0.9_2	200	2	0.05(0)	0.07(0)	0.07(0)	0.714	0.714
san200_0.9_3	200	2	0.62(44)	0.22(0)	0.31(0)	2.818	2.0
san400_0.5_1	400	2	40.50(839)	2.18(0)	2.19(0)	18.57	18.49
san400_0.7_1	400	2	12.64(0)	4.19(0)	4.18(0)	3.016	3.023
san400_0.7_2	400	2	92.20(3294)	9.54(0)	21.80(8633)	9.664	4.229
san400_0.7_3	400	2	335.00(57914)	84.05(93035)	66.63(123128)	3.985	5.027
san400_0.9_1	400	2	4.20(0)	1.57(0)	1.55(0)	2.675	2.709
sanr200_0.7	200	2	413.30(130364)	38.90(84111)	34.06(74947)	10.62	12.13
sanr200_0.9	200	2	815.59(504637)	110.19(527791)	55.30(447549)	7.401	14.74
sanr400_0.5	400	2	-	2759.21(866709)	2163.52(891225)	-	-
sanr400_0.7	400	2	-	-	-	-	-

Table 10: MaxClique benchmark solving time in seconds (number of nodes in parentheses) and speed-up for cplex solver with 1, 10, or 20 threads. '-': unsolved in 1h. Experiments were made on a medium-scale computer with cores running at 3 GHz.

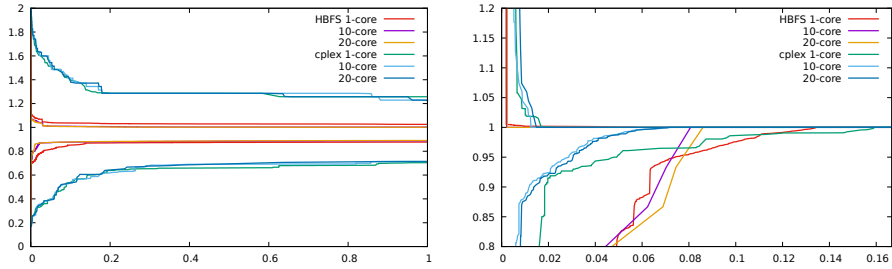


Figure 4: (Left fig.) Comparison on a medium-scale computer between toulbar2 using parallel HBFS (with burst mode) and cplex using multiple threads. The x-axis represents normalized time (with 1 corresponding to 3,600 seconds). The y-axis corresponds to normalized lower and upper bounds on 35 CPD instances (with 1 corresponding to the optimum or best known cost). (Right fig.) Same comparison for 15 Warehouses instances.

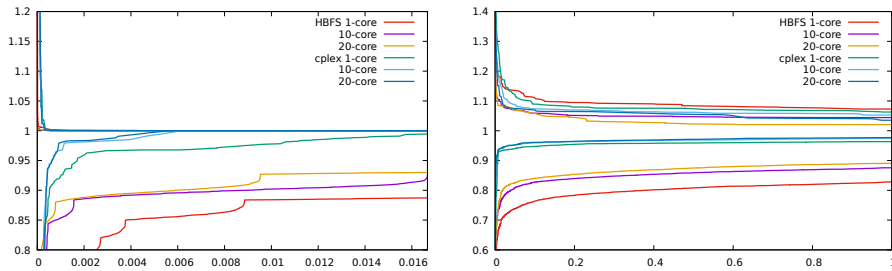


Figure 5: (Left fig.) Comparison on a medium-scale computer between toulbar2 using parallel HBFS (with burst mode) and cplex using multiple threads. The x-axis represents normalized time (with 1 corresponding to 3,600 seconds). The y-axis corresponds to normalized lower and upper bounds on 22 Linkage instances (with 1 corresponding to the optimum or best known cost). (Right fig.) Same comparison for 62 MaxClique instances.

Instance	n	d	HBFS-1	HBFS-180	Speed-180
1BK2	22	145	0.052(48)	0.131(60)	0.396
1BRS	38	178	508.512(154898)	37.541(211013)	13.54
1C9O	35	177	0.372(566)	0.386(1462)	0.963
1CDL	38	170	368.057(70451)	18.306(220318)	20.10
1CMI	42	167	2.105(304)	1.421(462)	1.481
1CSE	40	114	0.017(16)	0.110(16)	0.154
1CSK	18	41	0.013(39)	0.098(42)	0.132
1CSP	14	142	0.244(798)	0.270(4294)	0.903
1CTF	36	43	0.205(974)	0.208(6614)	0.985
1DKT	45	174	0.485(355)	0.497(730)	0.975
1ENH	36	156	-	-	-
1FNA	29	45	0.102(449)	0.226(2120)	0.451
1FYN	21	183	0.636(106)	0.604(200)	1.052
1GVP	52	170	771.199(193685)	16.960(280594)	45.47
1HNG	57	168	0.664(1646)	0.626(10219)	1.060
1L63	73	175	0.179(199)	0.266(216)	0.672
1LZ1	53	43	0.897(5128)	0.259(30140)	3.463
1MJC	5	136	0.006(2)	0.094(2)	0.063
1NXB	25	35	0.011(17)	0.094(17)	0.117
1PGB	31	179	-	-	-
1PIN	26	185	1.260(992)	0.984(7146)	1.280
1POH	31	168	0.030(39)	0.112(39)	0.267
1RIS	55	165	101.082(25676)	14.068(119841)	7.185
1SHF	20	47	0.016(16)	0.105(16)	0.152
1SHG	18	50	0.053(536)	0.144(3078)	0.368
1STN	120	180	-	-	-
1TEN	21	43	0.015(109)	0.115(101)	0.130
1UBI	35	141	1.079(3687)	0.683(29429)	1.579
2CI2	48	180	-	-	-
2DRI	34	179	155.979(131753)	10.400(360841)	14.99
2PCY	32	44	0.028(39)	0.142(39)	0.197
2RN2	52	43	0.149(272)	0.186(427)	0.801
2TRX	56	179	0.238(328)	0.323(310)	0.736
3CHY	66	56	58.544(82898)	5.035(238679)	11.62
3HHR	115	175	-	-	-

Table 11: CPD benchmark solving time in seconds (number of nodes in parentheses) and speed-up for sequential versus parallel HBFS (with burst mode) in toulbar2. '-': unsolved in 10h for HBFS-1 or 1h for HBFS-180. Experiments were made on a large-scale cluster with cores running at 2.3 GHz.

Instance	n	d	HBFS-1	HBFS-180	Speed-180
capmo1	200	100	14.091(7450)	3.781(23832)	3.726
capmo2	200	100	3.876(3545)	2.204(6070)	1.758
capmo3	200	100	12.549(5548)	4.374(13565)	2.868
capmo4	200	100	3.171(2219)	1.964(3345)	1.614
capmo5	200	100	2.359(2244)	1.575(2873)	1.497
capmp1	400	200	247.903(22294)	57.282(53136)	4.327
capmp2	400	200	103.542(14218)	36.765(26063)	2.816
capmp3	400	200	109.467(14935)	37.947(31034)	2.884
capmp4	400	200	213.391(18909)	68.320(40794)	3.123
capmp5	400	200	70.143(13788)	26.921(22084)	2.605
capmq1	600	300	752.794(41558)	255.110(79859)	2.950
capmq2	600	300	1164.669(47832)	392.648(113938)	2.966
capmq3	600	300	645.461(39463)	214.766(81130)	3.005
capmq4	600	300	1187.680(45392)	340.353(114189)	3.489
capmq5	600	300	1353.350(45824)	446.052(130390)	3.034

Table 12: Warehouses benchmark solving time in seconds (number of nodes in parentheses) and speed-up for sequential versus parallel HBFS (with burst mode) in toulbar2. '-': unsolved in 10h for HBFS-1 or 1h for HBFS-180. Experiments were made on a large-scale cluster with cores running at 2.3 GHz.

Instance	n	d	HBFS-1	HBFS-180	Speed-180
pedigree13	274	3	12.154(155015)	1.959(283712)	6.204
pedigree18	288	5	1.112(10672)	0.237(37011)	4.691
pedigree19	259	5	8388.377(115302059)	69.097(147212141)	121.4
pedigree1	80	4	0.021(184)	0.118(805)	0.177
pedigree20	115	5	0.248(5273)	0.159(15696)	1.559
pedigree23	83	5	0.043(659)	0.122(1101)	0.352
pedigree25	169	5	0.144(2934)	0.195(19647)	0.738
pedigree30	296	5	1.530(15209)	0.431(71299)	3.549
pedigree31	261	4	2.258(32405)	0.346(75517)	6.526
pedigree33	176	4	0.106(1578)	0.168(6468)	0.630
pedigree34	224	4	0.385(6630)	0.215(33920)	1.790
pedigree37	143	4	0.044(494)	0.144(3320)	0.305
pedigree38	156	5	0.221(4356)	0.189(23576)	1.169
pedigree39	161	4	0.051(812)	0.134(2757)	0.380
pedigree40	274	6	-	1680.072(3485210910)	-
pedigree41	230	5	40.095(512625)	5.861(540050)	6.840
pedigree42	123	5	0.086(1556)	0.167(6717)	0.514
pedigree44	212	4	17.262(220064)	1.164(196109)	14.82
pedigree50	129	6	0.563(11124)	0.171(30764)	3.292
pedigree51	295	5	503.728(6133198)	5.743(10956927)	87.71
pedigree7	244	4	1.095(16205)	0.190(41103)	5.763
pedigree9	232	4	1.876(24462)	0.304(86907)	6.171

Table 13: Linkage benchmark solving time for Toulbar2 Burst version with 180 cores benchmark solving time in seconds (number of nodes in parentheses) and speed-up for sequential versus parallel HBFS (with burst mode) in toulbar2. '-': unsolved in 10h for HBFS-1 or 1h for HBFS-180. Experiments were made on a large-scale cluster with cores running at 2.3 GHz.

Instance	n	d	HBFS-1	HBFS-180	Speed-180
brock200_1	200	2	192.680(6629072)	1.247(4168113)	154.5
brock200_2	200	2	5.753(111981)	0.353(236904)	16.29
brock200_3	200	2	14.996(370784)	0.552(614202)	27.16
brock200_4	200	2	33.396(1127989)	0.579(1045035)	57.67
brock400_1	400	2	-	1812.532(4913769406)	-
brock400_2	400	2	-	879.885(2461802722)	-
brock400_3	400	2	-	457.001(1218759299)	-
brock400_4	400	2	-	393.766(969943882)	-
brock800_1	800	2	-	-	-
brock800_2	800	2	-	-	-
brock800_3	800	2	-	-	-
brock800_4	800	2	-	-	-
c-fat200-1	200	2	0.581(475)	0.472(665)	1.230
c-fat200-2	200	2	0.489(467)	0.528(1063)	0.926
c-fat200-5	200	2	0.262(499)	0.431(2589)	0.607
c-fat500-10	500	2	7.678(1599)	5.833(10571)	1.316
c-fat500-1	500	2	13.585(1065)	8.238(1320)	1.649
c-fat500-2	500	2	12.894(1197)	7.675(2379)	1.68
c-fat500-5	500	2	11.044(1588)	7.970(8526)	1.385
hamming10-2	1024	2	0.071(256)	0.156(256)	0.455
hamming10-4	1024	2	-	-	-
hamming6-2	64	2	0.003(16)	0.119(16)	0.025
hamming6-4	64	2	0.032(1731)	0.109(1942)	0.293
hamming8-2	256	2	0.009(64)	0.125(64)	0.072
hamming8-4	256	2	81.407(2225278)	1.980(1754776)	41.11
johnson16-2-4	120	2	63.304(4446093)	0.983(3679681)	64.39
johnson32-2-4	496	2	-	-	-
johnson8-2-4	28	2	0.005(310)	0.107(350)	0.046
johnson8-4-4	70	2	0.083(4360)	0.149(7429)	0.557
keller4	171	2	20.536(865323)	1.006(658678)	20.41
keller5	776	2	-	-	-
MANN_a27	378	2	2.492(101564)	0.205(42097)	12.15
MANN_a45	1035	2	1653.564(51000545)	5.494(19568286)	300.9
MANN_a81	3321	2	-	-	-
MANN_a9	45	2	0.003(48)	0.100(45)	0.03
p_hat1000-1	1000	2	1052.774(4320505)	54.050(4220989)	19.47
p_hat1000-2	1000	2	-	-	-
p_hat1000-3	1000	2	-	-	-
p_hat300-1	300	2	9.781(52496)	0.954(139252)	10.25
p_hat300-2	300	2	26.115(404290)	0.833(493415)	31.35
p_hat300-3	300	2	4186.002(98363142)	5.404(17026384)	774.6
p_hat500-1	500	2	73.752(340431)	6.513(1741366)	11.32
p_hat500-2	500	2	2563.109(24781134)	18.296(8553910)	140.0
p_hat500-3	500	2	-	-	-
p_hat700-1	700	2	294.866(1105721)	14.593(1130223)	20.20
p_hat700-2	700	2	-	751.873(768842909)	-
p_hat700-3	700	2	-	-	-
san1000	1000	2	-	-	-
san200_0.7_1	200	2	309.192(17257759)	38.200(207958887)	8.094
san200_0.7_2	200	2	-	-	-
san200_0.9_1	200	2	0.302(6698)	0.184(40263)	1.641
san200_0.9_2	200	2	8.095(203789)	0.320(138461)	25.29
san200_0.9_3	200	2	2489.096(86332248)	18.066(71321410)	137.7
san400_0.5_1	400	2	-	1220.347(3960964343)	-
san400_0.7_1	400	2	-	-	-
san400_0.7_2	400	2	-	-	-
san400_0.7_3	400	2	-	-	-
san400_0.9_1	400	2	-	88.830(194097616)	-
sanr200_0.7	200	2	66.691(2094971)	1.353(1728672)	49.29
sanr200_0.9	200	2	4510.857(155684986)	30.682(131733784)	147.0
sanr400_0.5	400	2	941.357(8894646)	4.368(5817184)	215.5
sanr400_0.7	400	2	-	471.271(1203449249)	-

Table 14: MaxClique benchmark solving time in seconds (number of nodes in parentheses) and speed-up for sequential versus parallel HBFS (with burst mode) in toulbar2. '-': unsolved in 10h for HBFS-1 or 1h for HBFS-180. Experiments were made on a large-scale cluster with cores running at 2.3 GHz.