





















**Table 5** The detailed coordinates of the disks for instance 2.2

**表 5** QPAS 在算例 2.2 上的布局坐标

序号	$x$	$y$	$r$	序号	$x$	$y$	$r$
1	80.1351323284289380	-174.2023068567893600	23.72	7	8.4862674099740953	-166.9895225393457300	48.26
2	-190.9252746029229700	17.7190075114753010	23.72	8	-148.8655241280515600	76.1366994473319070	48.26
3	-126.1192497662789800	144.4281879554832200	23.72	9	140.3744397256365100	90.8527312565984600	48.26
4	188.1446426120991200	37.0091421663224690	23.72	10	-5.8696703055848909	115.3207713477796400	100.00
5	-62.0317319779710490	-181.4379769711466100	23.72	11	102.8055527267827500	-52.5771020719231150	100.00
6	110.8164212362197800	156.4843261553089900	23.72	12	-96.9358824217438840	-62.7436692651842520	100.00

**Table 6** The detailed coordinates of the disks for instance 2.3

**表 6** QPAS 在算例 2.3 上的布局坐标

序号	$x$	$y$	$r$	序号	$x$	$y$	$r$
1	-34.4285028640997980	15.3599224650793880	1	9	29.5978182608661910	4.8850041441504137	9
2	33.7982848157157110	15.0514234115894800	2	10	19.8145470847353020	21.1726506049652740	10
3	-21.6524602536760750	28.4376011278335700	3	11	24.0525861758465070	-14.3308851436723210	11
4	12.0850842044562640	32.8455050566270970	4	12	-3.0581017131112964	26.7483741738768860	12
5	-14.3018406622605100	-30.8437570028816100	5	13	2.9847288377083285	-25.8263358602666740	13
6	-25.3871342260474290	20.2490597241375770	6	14	5.2082358848268644	2.0974581114548387	14
7	-30.5954319015216850	8.3379877604766062	7	15	-21.0677897267708370	-11.4918895611060560	15
8	-15.0382783779291960	10.7043541958554160	8				

对于第 3 组算例,表 7 给出了 QPAS 与 PA<sup>[5]</sup>和 SATS<sup>[4]</sup>的计算结果的比较.在这 3 种算法中,QPAS 的计算结果很接近于典型的圆形 Packing 问题的最好结果.由于带平衡约束的圆形 Packing 问题比典型的圆形 Packing 问题多了一项平衡约束,后者最优解一定好于等于前者的最优解.因此 QPAS 计算结果略弱于典型圆形 Packing 问题的解是可以理解的.另外,QPAS 在算例 3.1 找到了更小的外包络圆半径.QPAS 在第 3 组算例取得的布局如图 6 和图 7 所示.

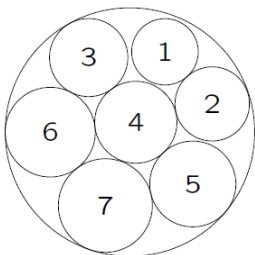


Fig.3 Packing layout of instance 1.4

图 3 算例 1.4 的布局图

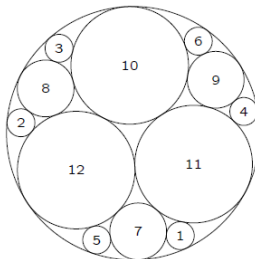


Fig.4 Packing layout of instance 2.2

图 4 算例 2.2 的布局图

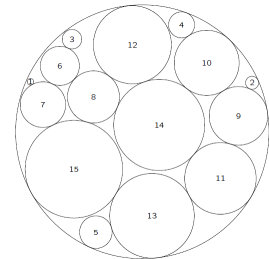


Fig.5 Packing layout of instance 2.3

图 5 算例 2.3 的布局图

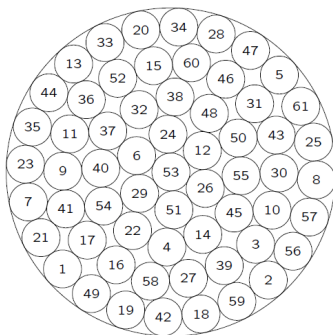


Fig.6 Packing layout of instance 3.1

图 6 算例 3.1 的布局图

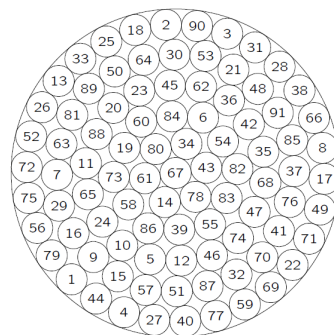


Fig.7 Packing layout of instance 3.2

图 7 算例 3.2 的布局图

**Table 7** Computing results on the third set of instances

表 7 第 3 组算例计算结果比较

算例	$n$	PA		SATS		QPAS		
		$R_0$	$T(s)$	$R_0$	$T(s)$	$R_0$	$J$	$T(s)$
算例 3.1	61	173,226	0.32	173.226	0.52	<b>173.225 951 5</b>	$2.40 \times 10^{-8}$	345.423
算例 3.2	91	—	—	211.334	4.85	211.335 449 2	$3.53 \times 10^{-8}$	453.229

## 5 结 论

对于带平衡约束的圆形 Packing 问题,基于弹力模型和拉力模型,把拟物下降方法与若干拟人策略相结合以提高连续优化的效率.当拟物过程遇到局部陷阱需要跳坑时,由于外包络圆中的剩余空间都是不规则的,很难通过精确计算从中选出最空闲的空间以作为跳坑的位置.本文通过化圆为方,将外包络圆和待置入圆饼近似看做矩形,并借鉴求解矩形 Packing 问题的拟人算法中动作空间的概念,把不规则的剩余空间转化为易计算和比较的矩形空间,从而较快且较准确地找到最空闲空间.对国际上公开的 13 个代表性算例的计算结果表明,所提的拟物求解算法是快速且有效的.在今后的工作中,拟进一步提高基于动作空间的跳坑方法的有效性,并将其应用到一般的圆形 Packing 问题的求解中去.

## References:

- [1] Kang Y, Huang WQ. A fast quasi-physical algorithm for the disks packing problem. *Computer Engineering and Applications*, 2003, 39(35):30–32 (in Chinese with English abstract).
- [2] Wang HQ, Huang WQ, Zhang Q, Xu DM. An improved algorithm for the packing of unequal circles within a larger containing circle. *European Journal of Operational Research*, 2002, 141(2):440–453.
- [3] Liu JF, Zhou GC, Pan JJ. Heuristic algorithm based on Taboo search for sphere packing problem. *Application Research of Computers*, 2011, 28(3):892–894 (in Chinese with English abstract).
- [4] Zhang D, Deng A. An effective hybrid algorithm for the problem of packing circles into a larger containing circle. *Computers & Operations Research*, 2005, 32(8):1941–1951.
- [5] Zhang DF, Li X. A personified annealing algorithm for circles packing problem. *Acta Automatica Sinica*, 2005, 31(4):590.
- [6] Theodoracatos VE, Grimsley JL. The optimal packing of arbitrarily-shaped polygons using simulated annealing and polynomial-time cooling schedules. *Computer & Methods in Applied Mechanics and Engineering*, 1995, 125(1):53–70.
- [7] Graham RL, Lubachevsky BD, Nurmela KJ, Östergård PRJ. Dense packing of congruent circles in a circle. *Discrete Mathematics*, 1998, 181(1):139–154.
- [8] Yu Y, Cha JZ, Tang XJ. Learning based GA and application in packing. *Chinese Journal of Computers*, 2001, 24(12):1242–1249 (in Chinese with English abstract).
- [9] Teng HF, Sun SL, Ge WH, Zhong WX. Layout optimization for the dishes installed on a rotating table—the packing problem with equilibrium behavioural constraints. *SCIECE IN CHINA (Series A)*, 1994, 37(10):1272–1280.
- [10] Tang F, Teng HF. A modified genetic algorithm and its application to layout optimization. *Ruan Jian Xue Bao/Journal of Software*, 1999, 10(10):1096–1102 (in Chinese with English abstract). [doi: 10.13328/j.cnki.jos.1999.10.014]
- [11] Qian ZQ, Teng HF, Sun ZG. Human-Computer interactive genetic algorithm and its application to constrained layout optimization. *Chinese Journal of Computers*, 2001, 24(5):553–559 (in Chinese with English abstract).
- [12] Huang WQ, Chen M. Note on: An improved algorithm for the packing of unequal circles within a larger containing circle. *Computers & Industrial Engineering*, 2006, 50(3):338–344.
- [13] Li N, Liu F, Sun DB. A study on the particle swarm optimization with mutation operator constrained layout optimization. *Chinese Journal of Computers*, 2004, 27(7):897–903 (in Chinese with English abstract).
- [14] Lei KY, Qiu YH. A study of constrained layout optimization using adaptive particle swarm optimizer. *Journal of Computer Research and Development*, 2006, 43(10):1724–1731 (in Chinese with English abstract).
- [15] Liu J, Huang WQ. A fast local search algorithm for solving circles packing problem with constraints of equilibrium. *Journal of Image and Graphics*, 2008, 13(5):991–997 (in Chinese with English abstract).
- [16] Wang YS, Shi YJ, Teng HF. An improved scatter search for circles packing problem with the equilibrium constraint. *Chinese Journal of Computers*, 2009, 32(6):1214–1221 (in Chinese with English abstract).

- [17] 刘景发,李刚.求解带平衡性能约束的圆形装填问题的吸引盘填充算法.中国科学:信息科学,2010,40(3):423-432.
- [18] Liu JF, Li G, Chen DB, Liu WJ, Wang YL. Two-Dimensional equilibrium constraint layout using simulated annealing. Computers & Industrial Engineering, 2010,59(4):530-536.
- [19] 李刚,刘景发.基于禁忌搜索的启发式算法求解带平衡约束的圆形装填问题.中国科学:信息科学,2011,41(9):1076-1088.
- [20] He K, Mo DZ, Xu RC, Huang WQ. A quasi-physical algorithm based on coarse and fine adjustment for solving circles packing problem with constraints of equilibrium. Chinese Journal of Computers, 2013,26(6):1224-1234 (in Chinese with English abstract).
- [21] He K, Huang WQ. An efficient placement heuristic for three-dimensional rectangular packing. Computer & Operations Research, 2011,38(1):227-233.
- [22] 何琨,黄文奇.三维矩形 Packing 问题的拟人求解算法.中国科学:信息科学,2010,40(12):1586-1595.
- [23] He K, Huang WQ, Jin Y. An efficient deterministic heuristic for two-dimensional rectangular packing. Computers & Operations Research, 2012,39(7):1355-1363.
- [24] He K, Huang WQ, Jin Y. Efficient algorithm based on action space for solving the 2D rectangular packing problem. Ruan Jian Xue Bao/Journal of Software, 2012,23(5):1037-1044 (in Chinese with English abstract). <http://www.jos.org.cn/1000-9825/3986.htm> [doi: 10.3724/SP.J.1001.2012.03986]

#### 附中文参考文献:

- [1] 康雁,黄文奇.求解圆形 Packing 问题的一个快速拟物算法.计算机工程与应用,2003,39(35):30-32.
- [3] 刘景发,周国城,潘锦基.基于禁忌搜索的启发式算法求解球体 Packing 问题.计算机应用研究,2011,28(3):892-894.
- [8] 于洋,查建中,唐晓君.基于学习的遗传算法及其在布局中的应用.计算机学报,2001,24(12):1242-1249.
- [10] 唐飞,滕弘飞.一种改进的遗传算法及其在布局优化中的应用.软件学报,1999,10(10):1096-1102. [doi: 10.13328/j.cnki.jos.1999.10.014]
- [11] 钱志勤,滕弘飞,孙治国.人机交互的遗传算法及其在约束布局优化中的应用.计算机学报,2001,24(5):553-559.
- [13] 李宁,刘飞,孙德宝.基于带变异算子粒子群优化算法的约束布局优化研究.计算机学报,2004,27(7):897-903.
- [14] 雷开友,邱玉辉.基于自适应粒子群优化算法的约束布局优化研究.计算机研究与发展,2006,43(10):1724-1731.
- [15] 刘建,黄文奇.求解带平衡约束圆形 Packing 问题的快速局部搜索算法.中国图像图形学报,2008,13(5):991-997.
- [16] 王奕首,史彦军,滕弘飞.用改进的散射搜索法求解带平衡约束的圆 Packing 问题.计算机学报,2009,32(6):1214-1221.
- [20] 何琨,莫旦增,许如初,黄文奇.基于粗精调技术的求解带平衡约束圆形 Packing 问题的拟物算法.计算机学报,2013,26(6):1224-1234.
- [24] 何琨,黄文奇,金燕.基于动作空间的求解二维矩形 Packing 问题的高效启发式算法.软件学报,2012,23(5):1037-1044. <http://www.jos.org.cn/1000-9825/3986.htm> [doi: 10.3724/SP.J.1001.2012.03986]



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