

Dense Packings of Congruent Circles in Rectangles with a Variable Aspect Ratio

Boris D. Lubachevsky
bdl@bell-labs.com
 Bell Laboratories
 600 Mountain Avenue
 Murray Hill, New Jersey

Ronald Graham
graham@ucsd.edu
 University of California
 at San Diego
 La Jolla, California

Abstract

We use computational experiments to find the rectangles of minimum area into which a given number n of non-overlapping congruent circles can be packed. No assumption is made on the shape of the rectangles. Most of the packings found have the usual regular square or hexagonal pattern. However, for 1495 values of n in the tested range $n \leq 5000$, specifically, for $n = 49, 61, 79, 97, 107, \dots, 4999$, we prove that the optimum cannot possibly be achieved by such regular arrangements. The evidence suggests that the limiting height-to-width ratio of rectangles containing an optimal hexagonal packing of circles tends to $2 - \sqrt{3}$ as $n \rightarrow \infty$, if the limit exists.

Key words: disk packings, rectangle, container design, hexagonal, square grid

AMS subject classification: primary 52C15, secondary 05B40, 90C59

1. Introduction

Consider the task of finding the smallest area rectangular region that encloses a given number n of circular disks of equal diameter. The circles must not overlap with each other or extend outside the rectangle. The aspect ratio of the rectangle, i.e., the ratio of its height to width, is variable and subject to the area-minimizing choice as well as the positions of the circles inside the rectangle.

Packing circles in a square has been the subject of many investigations [GL], [NO1], [NO2], [NO3]. Because the aspect ratio is not fixed in our present problem, the solutions are typically different from the dense packings in a square. For example, the density $\pi/4 = 0.785\dots$ of the proved optimum (see [NO3]) for packing 25 congruent circles in a square (see Figure 1.1a) can be increased to $25\pi/(26(2 + \sqrt{3})) = 0.809\dots$, if we let the rectangle assume its best aspect ratio (see Figure 1.1b). Our experiments offer only three values of n for which

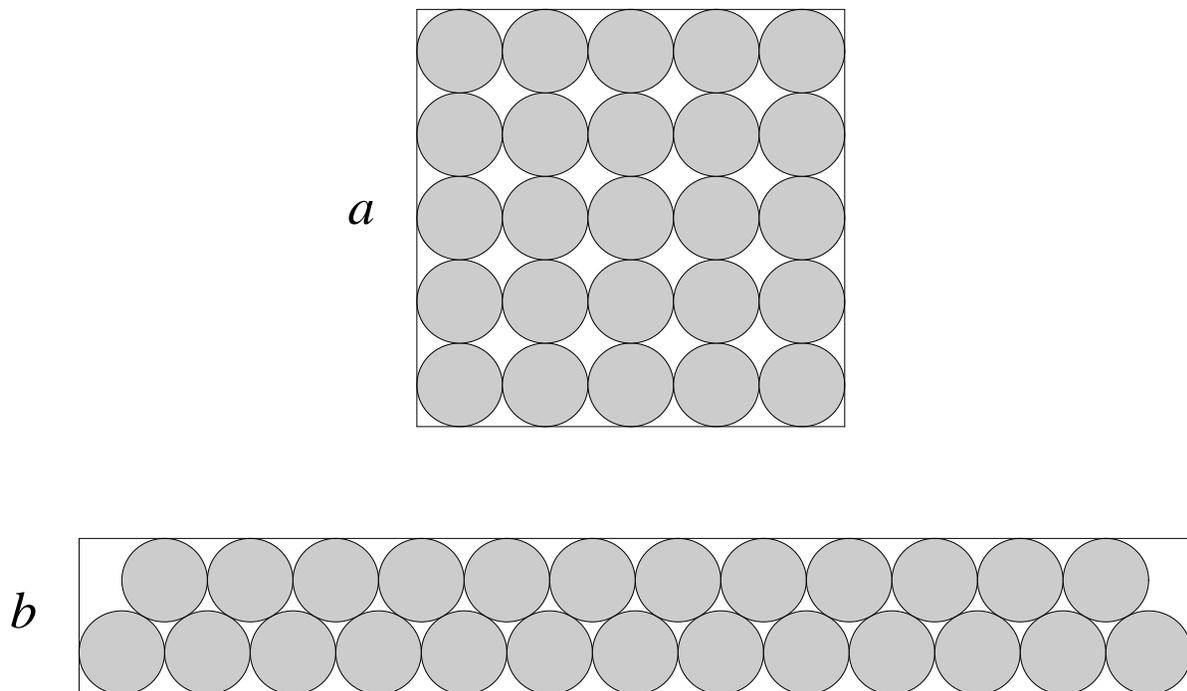


Figure 1.1: The best packings found for 25 circles *a*) in a square, and, *b*) in a rectangle with variable aspect ratio.

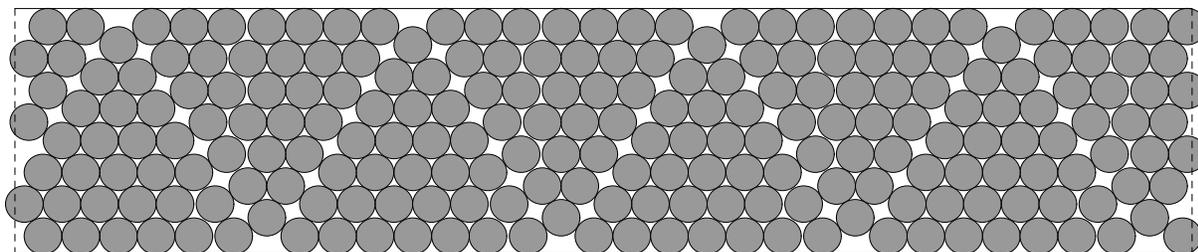


Figure 1.2: A 224-circle fragment of the packing with the highest density found in a long rectangle with a fixed aspect ratio.

the dense packing in a square is also a solution to our present problem: $n = 4, 9$, and of course, $n = 1$.

Similarly, dense packings in long rectangles with a fixed aspect ratio usually do not yield solutions for our problem. According to a long-standing conjecture attributed to Molnar (see [Füredi]), dense packings in long fixed rectangles tend to form periodic up and down alternating triangular “teeth,” as in the example shown in Figure 1.2. We can usually increase the density of such packings by slightly changing the aspect ratio of the rectangle.

The present problem has been occasionally mentioned among packing problems ; for example, Web enthusiasts have recently began discussing it. However, the problem was considered as early as in 1970 in [Ruda], where the optimum packings were determined for all $n \leq 8$ and conjectured for $9 \leq n \leq 12$. We learned about Ruda’s results after we performed our computations and made our conjectures. Fortunately, our conjectures restricted to the values $n \leq 12$ agree with the results and conjectures in [Ruda]!

It appears that the complexity of the proofs of optimality in the packing-circles-in-a-square problem increases exponentially with n ; computer generated/assisted proofs of optimality of such packings do not reach $n = 30$ (see [NO3] ; proofs that do not utilize computers have not been found except for quite small values of n), while conjectures extend to $n = 50$ and even much larger values (see [NOR]).

Similarly, it seems to be difficult for the present problem to prove optimality for the configurations we find. This paper describes an experimental approach, where good packings are obtained with the help of a computer. Some of these packings hopefully will be proved optimal in the future. At present, most of the statements about the packings made in this paper are only conjectures, except for a few which we explicitly claim as proven. For instance, we prove that the best packings found are better than any other in their class, e.g., that the packing of 79 circles with a monovacancy (see Figure 2.3a), while non-optimal, is better than any hexagonal or square grid packing of 79 circles without a monovacancy. Also, we prove that $n = 11$ is the smallest n for which a hexagonal packing as in Figure 2.1 is better than any square grid packing of n circles.

2. A priori expectations and questions about best packings

Since it is well known that the hexagonal arrangement of congruent circles in the infinite plane has the highest possible density, (see [Th], [Ft], [FG],[Oler]), before plunging into our experiments, we expected to obtain good finite packings by “carving” rectangular subsets out of this infinite packing. It will be useful to classify here such finite arrangements. For that we will discuss packings in Figures 1.1b, 2.1, 2.2a, 2.2b, and 2.3a, irrespective of their optimality (which will be discussed in the following sections). For the purpose of exposition, we will pretend in this section that there are no holes in the arrangements in Figures 2.2b and 2.3a, that is, the question mark in the figures is covered with an additional circle of the common radius.

Under such an assumption, the arrangement in Figure 2.3a consists of $h = 5$ alternating rows with $w = 16$ circles in each, a total of $n = w \times h = 80$ circles. Arrangements as in Figures 1.1b, 2.1, 2.2a, and 2.2b, are obtained by depleting such $w \times h$ arrays of some circles along one side of the array. The ways of performing the depletion depend on the parity of h .

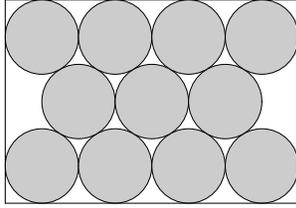


Figure 2.1: The best packing found for 11 circles in a rectangle.

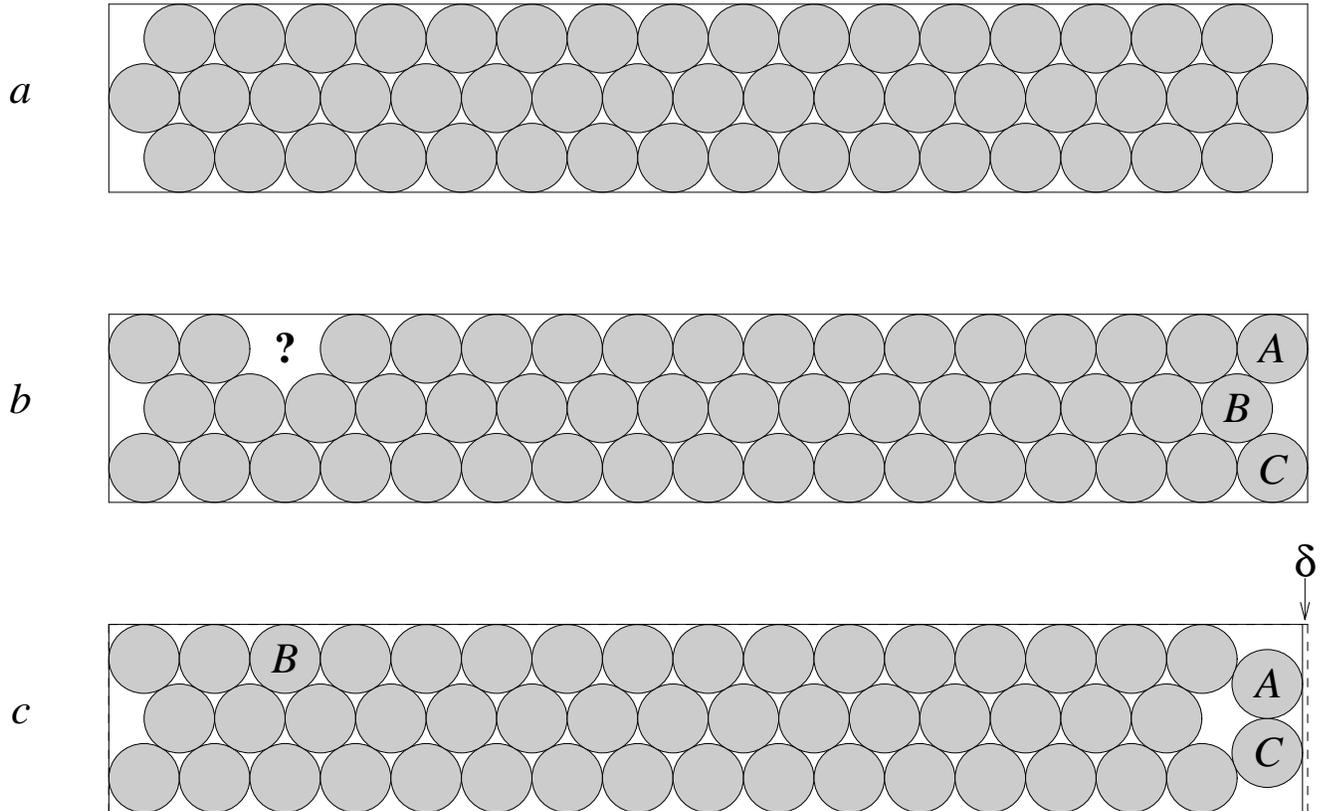


Figure 2.2: Packings of 49 circles in a rectangle: *a*) the best in the class of hexagonal packings, *b*) a best in the class of hexagonal packings with monovacancies (one of 17 equally dense packings with the hole), *c*) the best we found.

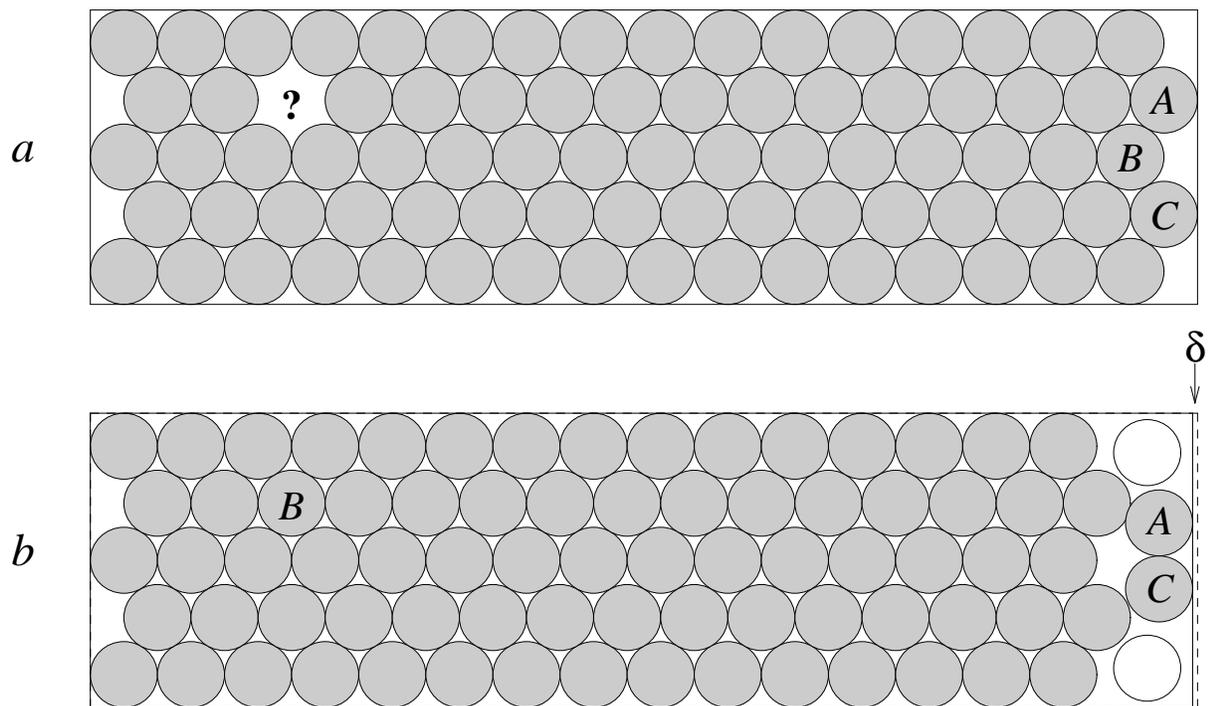


Figure 2.3: Packings of 79 circles in a rectangle: *a*) a best in the class of hexagonal packings with possible monovacancies, and, *b*) the best we found.

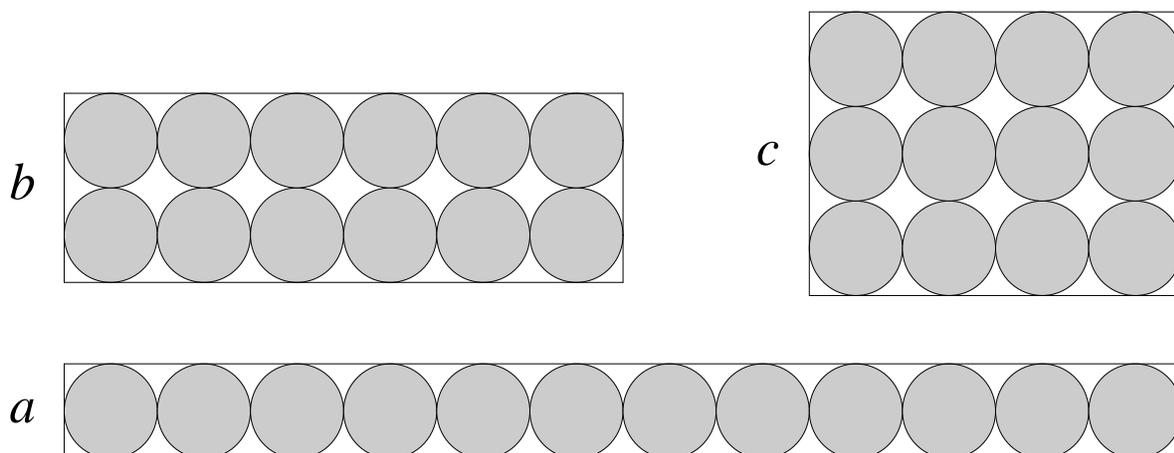


Figure 2.4: Best packings found for 12 circles in a rectangle.

If h is even, then the depletion can be done in only one way by removing $h/2$ circles. Figure 1.1b presents an example with $h = 2$.

The case of an odd h presents two possibilities: we can remove $\lfloor h/2 \rfloor$ circles on a side as in the example of Figure 2.2b, or $\lfloor h/2 \rfloor + 1$ circles on a side as in the example of Figure 2.2a.

Alternatively, one can consider rectangular square grid arrangements as candidates for the best packings, e.g., see those in Figure 2.4. The density of a square grid arrangement is fixed at $\pi/4$ independent of n . When both sides h and w of the carved rectangle tend to infinity, the hexagonal packing density tends to $\pi/(2\sqrt{3})$ which is the density of the hexagonal packing in the infinite plane. Since $\pi/(2\sqrt{3}) > \pi/4$, one naturally wonders for which n the best hexagonal grid arrangement becomes better than the square grid arrangement.

A natural question is whether or not both arrangements exhaust all possibilities for the best packing. In other words, does there exist an optimal packing of n disks in a rectangle such that it *cannot* be represented as being carved out by a rectangle from either square grid or hexagonal grid packing of the infinite plane?

3. Results of compactor simulations

To tackle the problem by computer, we developed a “compactor” simulation algorithm. The simulation begins by starting with a random initial configuration with n circles lying inside a (large) rectangle without circle-circle overlaps. The starting configuration is feasible but is usually rather sparse. Then the computer imitates a “compactor” with each side of the rectangle pressing against the circles, so that the circles are being forced towards each other until they “jam.” Possible circle-circle or circle-boundary conflicts are resolved using a simulation of a hard collision so that no overlaps occur during the process.

The simulation for a particular n is repeated many times, with different starting circle configurations. If the final density in a run is larger than the record achieved thus far, it replaces this record. Eventually in this process, the record stops improving up to the level of accuracy induced by the double precision accuracy of the computer. The resulting packing now becomes a candidate for the optimal packing for this value of n .

In this way we found that the square grid pattern with density $\pi/4$ supplies the optimum for $n = 1, \dots, 10$, and that $n = 11$ is the smallest number of circles for which a density better than $\pi/4$ can be reached; the density of this packing is $11\pi/(16(1 + \sqrt{3})) = 0.790558..$ The corresponding conjectured optimum pattern for $n = 11$ is shown in Figure 2.1. The pattern is hexagonal. For $n = 12$ and 13 the square grid pattern briefly takes over as the experimental optimum again (see Figure 2.4 for the case of $n = 12$). Remarkably, Ruda [Ruda] *proves* that for $n \leq 8$, the square-grid packings are optimal. His conjectures for $9 \leq n \leq 12$ also agree with our findings.

Our simulation results show that for $n \geq 14$, the best densities are larger than $\pi/4$. This statement is also easy to prove, considering examples of (not necessarily optimal) two-row hexagonal packings like that in Figure 1.1b for odd $n = 2m + 1 > 14$, or the ones with equal length rows for even $n = 2m \geq 14$. Assuming the circles have radius 1, the following inequalities

$$2(m + 1)(2 + \sqrt{3}) < 4(2m + 1) \tag{1}$$

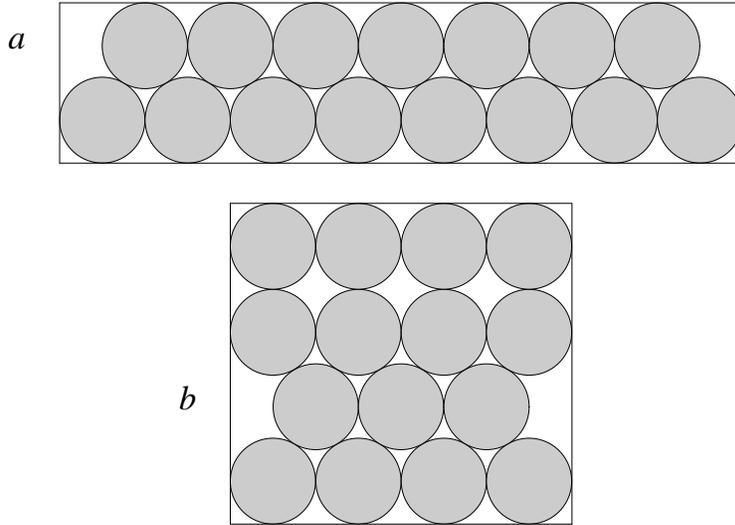


Figure 3.1: Two equally dense best packings found for 15 circles in a rectangle.

for $n = 2m + 1$ and

$$(2m + 1)(2 + \sqrt{3}) < 8m \quad (2)$$

for $n = 2m$ have to be satisfied. The left-hand sides in (1) and (2) are the areas of the enclosing rectangles for the two-row hexagonal packings, and the right-hand sides are the areas for the corresponding square grid packings. It is easily seen that all integers $m \geq 7$ satisfy either inequality. These correspond to all integer values of $n \geq 14$.

A surprise awaited us at the value $n = 15$. We found two different equally dense packings. One, shown in Figure 3.1a, is of the expected hexagonal type. However, the other, shown in Figure 3.1b, is not, nor can it be carved out of the square grid. It is easy to verify that two equally dense packings a and b of these types also exist for any n of the form $n = 15 + 4k$, $k = 1, 2, 3, \dots$. Packing a , such as that in Figure 3.1a, has two alternating rows, with one row one circle shorter than the other, and with the longer row consisting of $w = 8 + 2k$ circles. Packing b , such as that in Figure 3.1b, has 4 rows, the longest row having $w = 4 + k$ circles, three bottom rows alternate, the middle one having $w - 1$ circles, and the 4th row of w circles stacked straight on the top (or on the bottom; these would produce the same configuration). Our experiments suggest that for $k = 1$ and 4, i.e., for $n = 19$ and 31, these pairs of configurations might also be optimal; however, they are provably not optimal for other values of $k > 0$. The packings of pattern b for $n = 15, 19$, and 31, if they are proved to be optimal, answer positively the second question posed in Section 2.

Thus, the optimal container for 15 bottles apparently can have two different shapes, as can the optimal containers for 19 and 31 bottles! In an obvious way, more than one optimum container shape also exists for square grid packings of n circles if n is not a prime. See Figure 2.4 for the example of $n = 12$; there are three different rectangles which are equally good and probably optimal for $n = 12$. Apparently, three is the maximum number of rectangular shapes, any number n of circles can optimally fit in. It seems that for $n = 4, 6, 8, 9, 10, 15, 19$ and 31, there are exactly two shapes. For all other n tested, only one best

aspect ratio was found experimentally.

Another packing surprise awaited us at $n = 49$. Figures 2.2a and 2.2b show two among several equivalent packings achieved in our simulation experiments. The configuration a is hexagonal, while configuration b contains a monovacancy, that is, a hole than can accommodate exactly one circle. Monovacancies in hexagonal arrays of congruent circles appear often in the simulation experiments for $14 \leq n < 49$ but only in packings of inferior quality, so that a better quality hexagonal packing without monovacancies could always be found. No higher density hexagonal packing without monovacancies was found for $n = 49$.

Such large n already present substantial difficulties for our simulation procedure. The procedure failed to produce a packing which is better than those in Figures 2.2a and 2.2b. However, it is easy to prove that the density of a hexagonal packing in a rectangle with a monovacancy can be increased. For example, to improve the packing in Figure 2.2b we relocate circle B into the vacancy and then rearrange circles A and C along the side. This reduces the width of the rectangle by a small but positive δ as shown in Figure 2.2c, where $\delta = 2 - \sqrt{2\sqrt{3}} = 0.13879..$ of the circle radius. The density of c is $49\pi/(2(1 + \sqrt{3})(34 - \delta)) = 0.83200266...$

It is not known whether or not the resulting configuration c can be further improved. However, using the exhaustive search we show (see next section) that the optimum packing for 49 circles in a rectangle, whatever it might be, cannot be purely hexagonal. The value $n = 49$ is apparently the smallest one for which neither square-grid nor perfect hexagonal pattern delivers the optimum.

4. Exhaustive search

The simulation method becomes progressively slower for increasing n . However, by exercising the simulation for smaller n we are able to refine the idea of the class of packings which might deliver the optimum. We have chosen the class that consists of square grid and hexagonal packings and their hybrids; we also allow for monovacancies in configurations of the class, although these configurations are never optimal. We have extended our computing experiments to larger values of n using exhaustive search. For a given n , the method simply evaluates each candidate in the class by computing the area of the rectangle and selects the one with the smallest area. Note that for each n in this class, there are only a finite number of candidates.

A general packing in the class (see Figure 4.1), consists of $h + s$ rows and has d monovacancies. The h rows are hexagonally alternating, and the s rows are stacked directly on top of the previous row as in square grid packings. The longest row consists of w circles. Assuming all monovacancies are filled with circles, among the h hexagonal rows, h_- rows consist of $w - 1$ circles each, the remaining $h - h_-$ rows consist of w circles each, and among the s square grid rows, s_- rows consist of $w - 1$ circles each, and the remaining $s - s_-$ rows consist of w circles each. The number of circles in the configuration is

$$n = w(h + s) - h_- - s_- - d \tag{3}$$

Table 4.1 lists the best packings found of n circles in a rectangle with variable aspect ratio for n in the range $1 \leq n \leq 53$, and Table 4.2 continues this list for $54 \leq n \leq 213$. The

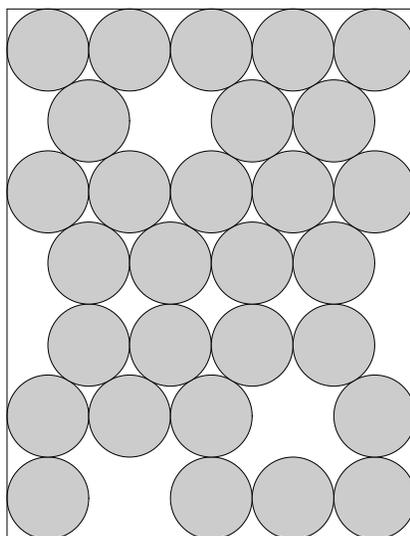


Figure 4.1: A “general case” member of the class of packings among which we search for the optimum; here $w = 5$, $h = 5$, $h_- = 2$, $s = 2$, $s_- = 1$, and $d = 3$.

packings in Table 4.1 are obtained by the simulation procedure described in Section 3 and verified by the exhaustive search. Most packings in Table 4.2 were generated only by the exhaustive search. An entry in either table consists of the n , followed by the set of integers which represent the parameters of the packing structure as explained above:

w , the number of circles in the longest row,

h , the number of rows arranged in a hexagonal alternating pattern,

h_- , the number of rows that consist of $w - 1$ circles each,

s , the number of rows, in addition to h rows, that are stacked in the square grid pattern.

Column s is absent in Table 4.2, because, as explained in Section 3, no optimum packing found for $n > 31$ has s positive. Also, for any n , no optimum packing was found with $s_- > 0$; thus, the s_- column is omitted.

In most packings presented in these two tables, the number of monovacancies $d = 0$, and so the d column is omitted. A few entries where monovacancies are possible are marked with stars. The non-starred entries describe the best packings found. The entries marked with stars cannot be optimal, as explained in Section 3.

An improved packing for the marked case of 49 circles can be obtained as described in Section 3 (see Figure 2.2). The next marked case $n = 61$ is similar; Table 4.1 lists the variant a for it with $h = 3$ and $h_- = \lfloor h/2 \rfloor + 1 = 2$. The following marked case is $n = 79$. Here too we improve the packing with the hole by relocating side circles. A , B , C , D , and E as shown in Figure 2.3, where the value of improvement δ is the same as in the case $n = 49$.

This method of relocation applies to all marked cases in the tables when h is odd. For example, for the case of $h = 5$, when $h_- = 3$ the relocation can be done as illustrated in Figure 4.3. This applies to the cases $n = 97$, 107, and 142 in Table 4.2. In all these cases, before using this method, we should replace listed in the tables variant that has $h_- =$

n	w	h	h_-	s	n	w	h	h_-	s	n	w	h	h_-	s
1	1	0	0	1	15	8	2	1	0	33	7	5	2	0
2	2	0	0	1		4	3	1	1	34	9	4	2	0
3	3	0	0	1	16	8	2	0	0	35	12	3	1	0
4	4	0	0	1	17	6	3	1	0	36	12	3	0	0
	2	0	0	2	18	9	2	0	0	37	19	2	1	0
5	5	0	0	1	19	10	2	1	0	38	13	3	1	0
6	6	0	0	1		5	3	1	1	39	13	3	0	0
	3	0	0	2	20	7	3	1	0	40	10	4	0	0
7	7	0	0	1	21	7	3	0	0	41	14	3	1	0
8	8	0	0	1	22	11	2	0	0	42	11	4	2	0
	4	0	0	2	23	8	3	1	0	43	9	5	2	0
9	9	0	0	1	24	8	3	0	0	44	15	3	1	0
	3	0	0	3	25	13	2	1	0	45	15	3	0	0
10	10	0	0	1	26	9	3	1	0	46	12	4	2	0
	5	0	0	2	27	9	3	0	0	47	16	3	1	0
11	6	2	1	0	28	6	5	2	0	48	10	5	2	0
12	12	0	0	12	29	10	3	1	0	*49	17	3	2	0
	6	0	0	2	30	10	3	0	0	50	17	3	1	0
	4	0	0	3	31	16	2	1	0	51	17	3	0	0
13	13	0	0	1		8	3	1	1	52	13	4	0	0
14	5	3	1	1	32	11	3	1	0	53	11	5	2	0

Table 4.1: Packings of n circles in a rectangle for $1 \leq n \leq 53$ with w circles in a row, h hexagonal rows, h_- of which consist of $w - 1$ circles each, and s square grid rows of w circles each. Except for the case $n = 49$ marked with a star, all packings are the best we could find.

$\lfloor h/2 \rfloor = 2$ with the variant that has $h_- = \lfloor h/2 \rfloor + 1 = 3$. This would produce a configuration with the pattern of the side as in Figure 4.3a. We would then improve this configuration by relocating circles A , B , C , D , and E to yield a configuration as in Figure 4.3b. The value of the improvement here is $\delta = 2 - 0.5\sqrt{3} - 3^{1/4}(2\sqrt{3} - 1)/(2\sqrt{4 - \sqrt{3}}) = 0.05728\dots$ of the circle radius. A similar method works for even h .

Sometimes during these improvements, some circles become the so-called *rattlers*, i.e., they become free to move and hit their neighbors, like the two unshaded circles in Figure 2.3. For glass bottles tightly packed in an empty box, packings with rattlers should definitely be avoided even though the box area was minimal!

The case $n = 79$ and several others are marked in Table 4.2 with two stars to signify that the packing not only *may* contain a monovacancy, but in fact, it *must*: any hexagonal packing of n circles without a monovacancy is provably worse than the one represented in the table when n is marked with two stars.

All such cases in the table also happen to have $h_- = 0$. Also, a double-star marked entry in Table 4.2 always has a discrepancy between the n computed from the parameters of the packing structure using (3), (here it would be $n = wh$), and actual n . In all the other cases, the n computed from the packing structure parameters using (3) will always match the correct n because there are no monovacancies. However, no entry without a monovacancy is possible in the double-star marked cases. Another observation: an entry $n + 1$ that follows an entry n marked by one or two stars, always has the same w and h , and hence its packing fits in the same rectangle as that of the entry n .

5. Best packings found for larger n

The exhaustive search procedure of Section 4 produces the best packings in the class defined in Section 4 for values of n on the order of several thousands. The features we observed for $n \leq 213$ hold until $n = 317$. Namely, only one best size rectangle exists for each n . Most of the best packings in the search class are perfectly hexagonal and unique for their n . Each such packing can be described by the set w , h , and h_- , with the latter parameter taking on up to three possible values:

$$\begin{aligned} \text{if } h \text{ is even} & \quad \text{then} \quad h_- = 0 \quad \text{or} \quad h_- = h/2 \\ \text{if } h \text{ is odd} & \quad \text{then} \quad h_- = 0 \quad \text{or} \quad h_- = \lfloor h/2 \rfloor \quad \text{or} \quad h_- = \lfloor h/2 \rfloor + 1 \end{aligned} \tag{4}$$

A few exceptional cases have a single monovacancy. These are similar to the one-star marked cases with odd h and with two options for h_- (the choice of the option defines the presence or absence of the vacancy), or they are similar to the two-star marked cases with $h_- = 0$.

The case $n = 317$ deviates from this pattern. Here, the best packing in the class has parameters $w = 27$, $h = 12$, $h_- = 6$, and $d = 1$. Unlike the one-star marked cases, h is even, and unlike the two-star marked cases, h_- is non-zero. Such a new type of packing recurs with one hole for $n = 334$ ($w = 34$, $h = 10$, and $h_- = 5$) and then for $n = 393$ ($w = 40$, $h = 10$, and $h_- = 5$), but in the latter case with *two* monovacancies. In other words, the best possible packing for 393 circles in a rectangle in the class of hexagonal packings with possible monovacancies must have two of them.

n	w	h	h_-	n	w	h	h_-	n	w	h	h_-	n	w	h	h_-
54	14	4	2	94	24	4	2	134	34	4	2	174	29	6	0
55	11	5	0	95	14	7	3	135	23	6	3	175	25	7	0
56	19	3	1	96	16	6	0	136	17	8	0	176	20	9	4
57	19	3	0	*97	20	5	3	137	20	7	3	177	30	6	3
58	12	5	2	98	20	5	2	138	28	5	2	178	36	5	2
59	20	3	1	99	17	6	3	*139	16	9	5	179	26	7	3
60	9	7	3	100	20	5	0	140	16	9	4	180	23	8	4
*61	21	3	2	101	34	3	1	141	24	6	3	**181	26	7	0
62	21	3	1	102	15	7	3	*142	29	5	3	182	26	7	0
63	13	5	2	103	21	5	2	143	29	5	2	183	37	5	2
64	16	4	0	104	12	9	4	144	21	7	3	184	23	8	0
65	22	3	1	105	18	6	3	145	29	5	0	185	21	9	4
66	17	4	2	106	27	4	2	146	37	4	2	186	27	7	3
67	10	7	3	*107	22	5	3	147	21	7	0	187	17	11	0
68	14	5	2	108	22	5	2	148	30	5	2	188	24	8	4
69	12	6	3	109	16	7	3	149	17	9	4	189	27	7	0
70	14	5	0	110	22	5	3	150	25	6	0	190	19	10	0
71	24	3	1	111	19	6	3	151	22	7	3	**191	24	8	0
72	18	4	0	112	16	7	0	152	19	8	0	192	24	8	0
73	15	5	2	113	23	5	2	153	31	5	2	193	28	7	3
74	11	7	3	114	19	6	0	154	22	7	0	194	22	9	3
75	15	5	0	115	23	5	0	155	31	5	0	195	20	10	5
76	19	4	0	116	17	7	3	156	20	8	4	196	25	8	4
77	26	3	1	117	20	6	3	*157	23	7	4	**197	22	9	0
78	16	5	2	118	24	5	2	158	23	7	3	198	22	9	0
**79	16	5	0	119	17	7	0	159	27	6	3	*199	29	7	4
80	16	5	0	120	20	6	0	160	20	8	0	200	29	7	3
81	12	7	3	*121	14	9	5	161	23	7	0	201	34	6	3
82	21	4	2	122	14	9	4	162	27	6	0	202	16	13	6
83	17	5	2	123	18	7	3	163	33	5	2	203	23	9	4
84	14	6	0	124	16	8	4	164	21	8	4	204	19	11	5
85	17	5	0	125	25	5	0	165	24	7	3	205	21	10	5
86	22	4	2	126	21	6	0	*166	19	9	5	*206	30	7	4
87	15	6	3	127	12	11	5	167	19	9	4	207	30	7	3
88	18	5	2	128	26	5	2	168	34	5	2	208	26	8	0
89	30	3	1	129	22	6	3	169	13	13	0	209	19	11	0
90	18	5	0	130	19	7	3	170	17	10	0	210	30	7	0
91	13	7	0	131	15	9	4	171	16	11	5	*211	24	9	5
92	23	4	0	132	22	6	0	172	25	7	3	212	24	9	4
93	19	5	2	133	27	5	2	173	35	5	2	213	36	6	3

Table 4.2: Packings of n circles in a rectangle for $54 \leq n \leq 213$ with w circles in a row, h hexagonal rows, h_- of which consist of $w - 1$ circles each. Except for the cases marked with stars, all packings are the best we could find.

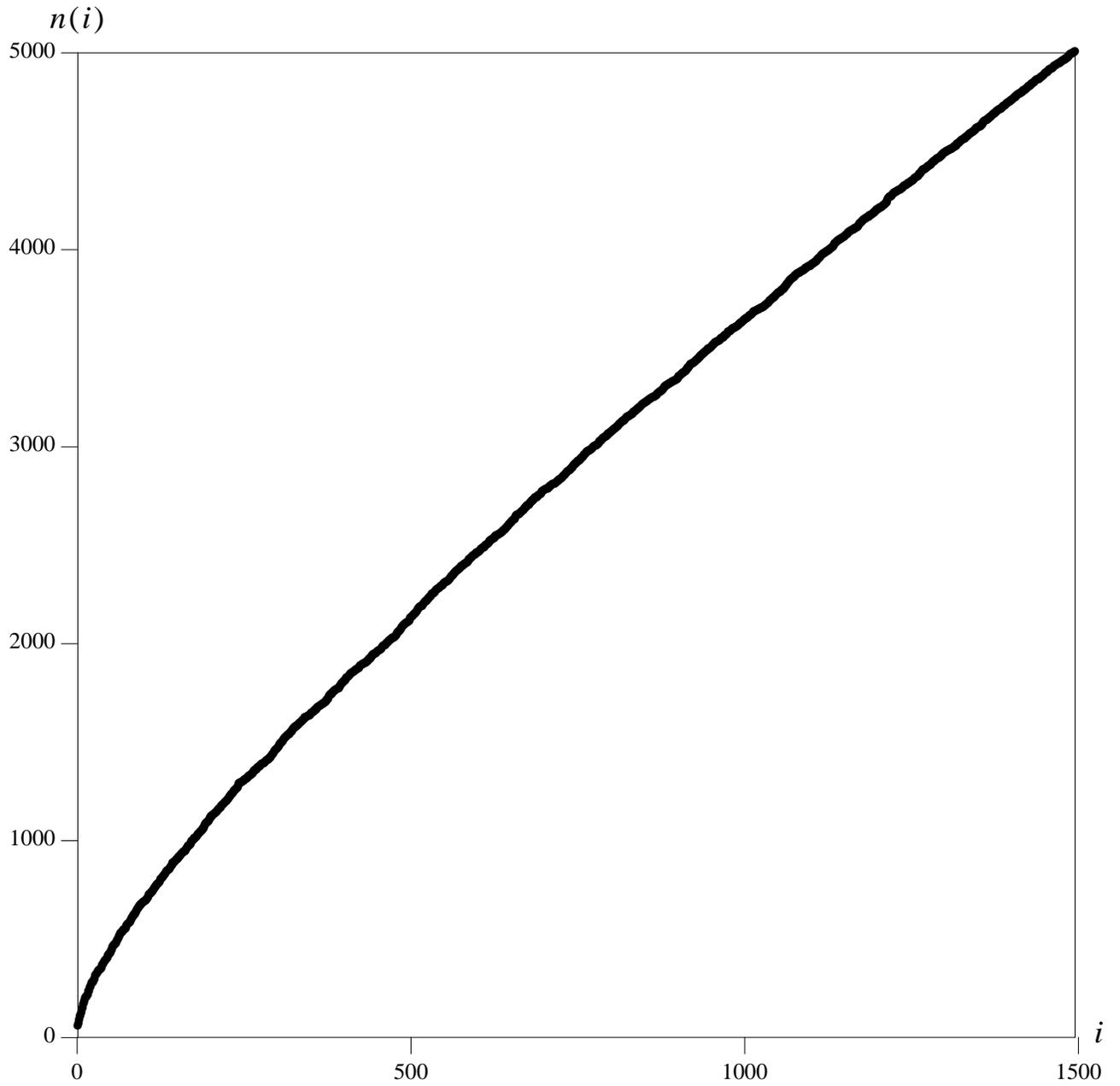


Figure 4.2: Numbers of circles $n(i)$ for which the optimum packing in a rectangle is not perfectly hexagonal for $49 \leq n(i) \leq 5000$ plotted versus the rank i .

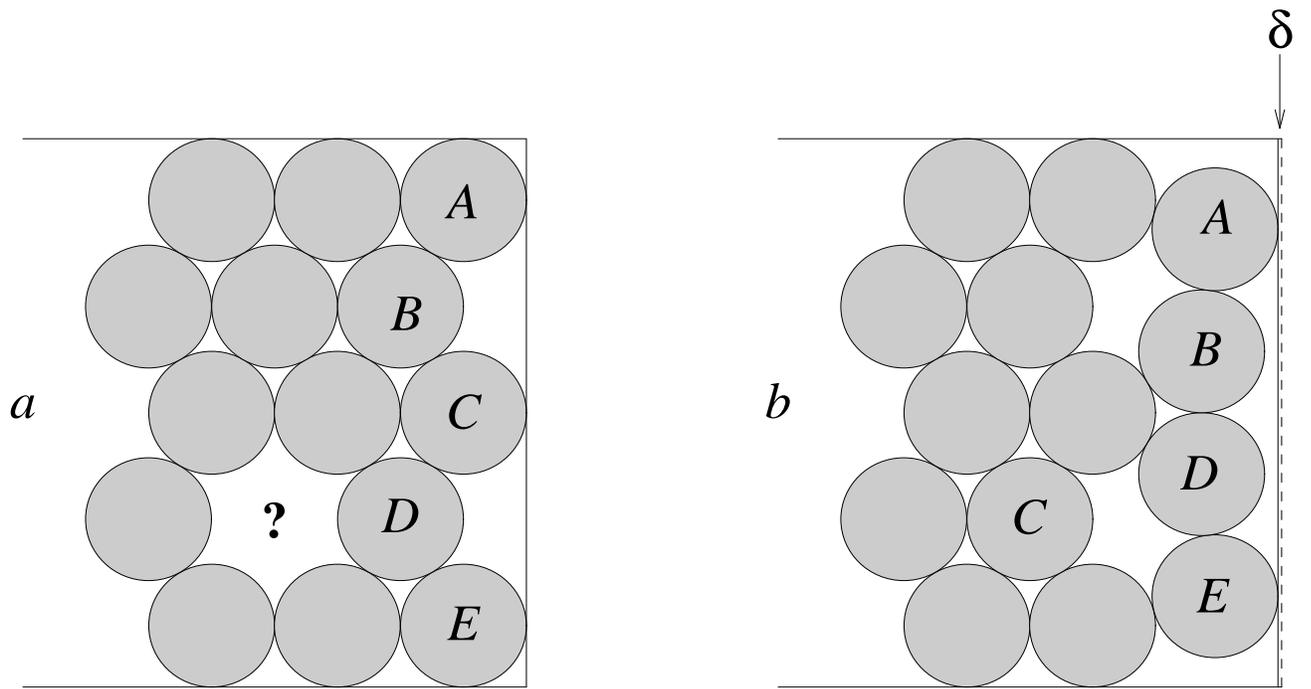


Figure 4.3: Improving a packing with a monovacancy when $h = 5$, $h_- = 2$: *a*) an original hexagonal packing with a monovacancy, *b*) the transformed packing.

With two holes, we have more freedom to improve the quality of the packing than having just one hole. Several ways are possible, including combining the ones described before for cases of smaller n . Same as for the other packings with monovacancies, the optimal packing for $n = 393$ is not known, but the exhaustive search in our experiments proves that it cannot be a hexagonal packing.

Naturally, the best packing (in the search class) of $n = 394$ circles also has parameters $w = 40$, $h = 10$, $h_- = 5$ and $d = 1$, i.e., a single monovacancy. The same rectangle also accommodates the best packing in the class of $n = 395$ circles, with the same $w = 40$, $h = 10$, $h_- = 5$. Since the latter packing is without holes, it is conceivable that it is optimal.

The next outstanding case is $n = 411$ where $w = 38$, $h = 11$, $h_- = 6$, and $d = 1$. This is the smallest n where the h is odd and $h_- = \lfloor h/2 \rfloor + 1$, that is, the packing looks like the one in Figure 2.2a, but unlike the latter it has a hole. An equivalent packing that looks like the one in Figure 2.2b, where $h_- = \lfloor h/2 \rfloor = 5$ also exists, but unlike the latter it has not one but two holes. For next value $n = 412$, we have a standard one-star marked situation with the same sizes of the rectangle, i.e., $w = 38$, $h = 11$ and $h_- = \lfloor h/2 \rfloor = 5$ for the variant with one hole and $h_- = \lfloor h/2 \rfloor + 1 = 6$ for the variant without holes.

The smallest n for which as many as three monovacancies exist in the best packing in the class is $n = 717$. The corresponding packing parameters are $w = 48$, $h = 15$, $h_- = 0$ and no hexagonal packing with a smaller number of holes can be better or even as good as this packing. Similarly, with four monovacancies, the smallest n is $n = 2732$ ($w = 86$, $h = 32$, and $h_- = 16$), and for five monovacancies, $n = 2776$ is the smallest ($w = 103$, $h = 27$, and $h_- = 0$). No optimum packing in the class for $n \leq 5000$ has six or more monovacancies.

In all, we found 1495 values of n on the interval $1 \leq n \leq 5000$ for which the best packing in the class must or can have monovacancies. As explained above, for each such n the best packing provably cannot be of a pure square-grid or hexagonal pattern. It is not proven though, but we believe it to be also true, that those 1495 values of n are *all* such irregular values among the considered 5000 values.

The chance to encounter such an irregular n seems to increase with n . For example, here are all the experimentally found irregular values of n among 100 consecutive values on the intervals $401 + 1000k \leq n \leq 500 + 1000k$ for $k = 0, 1, 2, 3, 4$:

17 values for $401 \leq n \leq 500$:

409, 411, 412, 421, 422, 433, 439, 453, 454, 461, 463, 467, 471, 478, 487, 489, 499.

24 values for $1401 \leq n \leq 1500$:

1401, 1402, 1405, 1409, 1412, 1414, 1423, 1427, 1429, 1434, 1446, 1447, 1451, 1453, 1457, 1459, 1466, 1468, 1477, 1483, 1486, 1487, 1489, 1497.

33 values for $2401 \leq n \leq 2500$:

2401, 2402, 2406, 2411, 2419, 2421, 2423, 2428, 2429, 2435, 2437, 2439, 2441, 2443, 2446, 2452, 2454, 2455, 2456, 2458, 2462, 2467, 2469, 2474, 2476, 2477, 2479, 2481, 2487, 2491, 2493, 2495, 2497.

33 values for $3401 \leq n \leq 3500$:

3407, 3409, 3411, 3412, 3414, 3415, 3418, 3421, 3425, 3428, 3431, 3433, 3436, 3442, 3446, 3447, 3453, 3455, 3459, 3461, 3464, 3467, 3469, 3473, 3476, 3479, 3481, 3487, 3489, 3490, 3493, 3494, 3499.

38 values for $4401 \leq n \leq 4500$:

4401, 4404, 4405, 4409, 4411, 4414, 4417, 4419, 4421, 4426, 4430, 4434, 4436, 4438, 4441, 4443, 4447, 4450, 4453, 4456, 4457, 4458, 4461, 4462, 4467, 4468, 4474, 4476, 4479, 4483, 4486, 4487, 4491, 4492, 4493, 4495, 4497, 4499.

Figure 4.2 represents these 1495 irregular values $n(i)$, $1 \leq n(i) \leq 5000$, beginning with $n(1) = 49$ and ending with $n(1495) = 4999$, by plotting points {abscissa = i , ordinate = $n(i)$ }.

6. The optimum aspect ratio for large n

Figure 6.1 contains for each n , a data point with coordinates

(abscissa = n , ordinate = best aspect ratio found for this n).

All $n \leq 5000$ are represented with the exception of a few n where the best packings found are of the square grid type. Also, the hybrid packings like those in Figure 3.1b are excluded. In this way we assure the uniqueness of the best aspect ratio for each n represented. The aspect ratios for the best packings in the search class are described in Section 4. The changes to the aspect ratios are due to the δ shrinkages of the rectangles in those cases with monovacancies, such as those in Figures 2.2, 2.3, and 4.3. Presumably these are small in number and should not be noticeable in Figure 6.1.

The data points tend to form patterns of descending and ascending “threads.” To examine the threads in detail, a rectangular box which is close to the y -axis in Figure 6.1 is magnified and represented in Figure 6.2. All data points present in the box can be found in Tables 4.1 and 4.2.

The steep downward threads correspond to configurations with fixed height, and with widths increasing by 1 from one point to the next as we move down the thread. Each such thread eventually terminates in either direction which means that the optimum rectangle cannot be too flat or too tall. The less steep upward and downward threads (they are dotted) correspond to sequences (w, h) , where from one point to the next w increases by 3 or 6 and h increases by 1 or 2, respectively.

To compute the optimum aspect ratio of the rectangle that encloses the optimum packing for large n , we analyze the area wasted along the rectangle sides. Note that in the infinite hexagonal packing, the uncovered area is $s = \sqrt{3} - \pi/2$ per each $\pi/2$ of the covered area. This is obvious from examining a single triangle XYZ in Figure 6.3 and observing that the entire infinite packing is composed of such triangles. The waste s here is the area of the central triangle formed by three circular arcs and it is equal to the full area $\sqrt{3}$ of triangle XYZ (assuming circle radius is 1) minus $\pi/2$, which is the total area of the three $\pi/6$ sectors covered. (By the way, we remind the reader that the density of the infinite hexagonal packing is $(\sqrt{3} - s)/(\pi/2) = \pi/(2\sqrt{3}) = 0.90689968\dots$)

The structure of the uncovered area in the infinite hexagonal packing can be also understood if we think of each covered circle bringing with it two curved uncovered triangles s , those adjacent to this circle on its right-hand side. With such bookkeeping, each triangle s will be counted exactly once. We conjecture that these two triangles s per each circle is the unavoidable, i.e., fixed, waste in any finite hexagonal packing carved out by a rectangle.

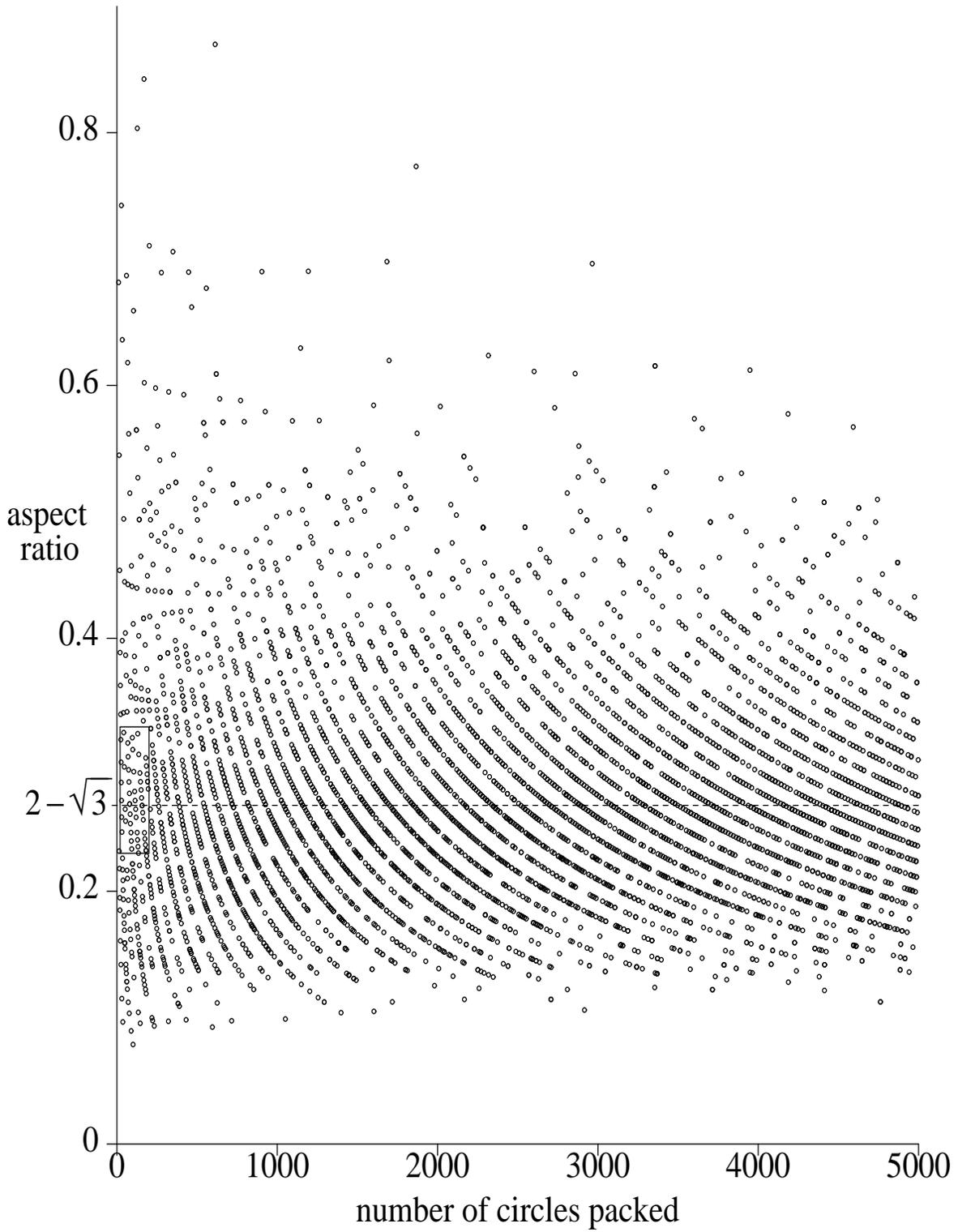


Figure 6.1: Values of the aspect ratio for optimal hexagonal packings.

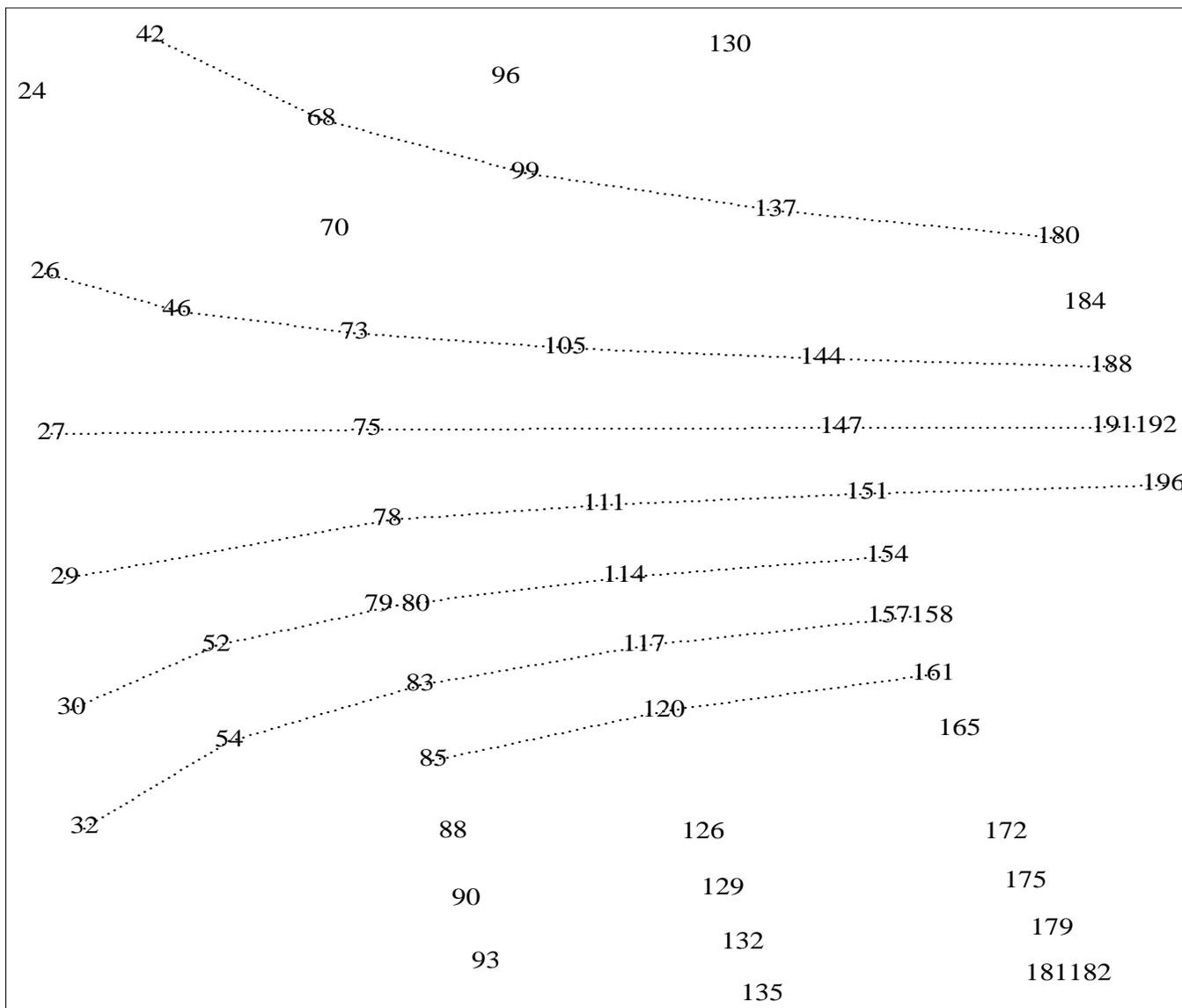


Figure 6.2: A box selected in Figure 6.1 magnified. Each data point in Figure 6.1 is replaced here with the corresponding number of circles.

area. Figure 6.1 includes a horizontal line at the level of the aspect ratio $2 - \sqrt{3}$.

7. Concluding remarks

As pointed out in the beginning of the paper, we hope that these computational results will lead to proofs of optimality for larger (or even infinite classes of) n .

Our experiments suggest that the frequency of occurrence of non-hexagonal best packings increases with n . It is not clear whether or not the frequency has a limit as $n \rightarrow \infty$ and if it has, whether or not this limit is smaller than 1. While it is not easy to find small $n \geq 14$ for which the best packing is not perfectly hexagonal, it might be more difficult to find large n for which the best packing *is* perfectly hexagonal. Do there exist infinitely many n , for which the densest packing of n circles in a rectangle is hexagonal?

A related phenomenon is conjectured to hold for $n = N(k)$ of the form $N(k) = \frac{1}{2}(a_k + 1)(b_k + 1)$ where a_k and b_k are given by:

$$\begin{aligned} a_1 &= 1, a_2 = 3, a_{k+2} = 4a_{k+1} - a_k \\ b_1 &= 1, b_2 = 5, b_{k+2} = 4b_{k+1} - b_k \end{aligned}$$

so that, $N(2) = 12$, $N(3) = 120$, $N(4) = 1512$, etc. The fractions $\frac{a_k}{b_k}$ are actually (alternate) convergents to $\frac{1}{\sqrt{3}}$, and it has been conjectured by Nurmela et al. [NOR] that for these n , a “nearly” hexagonal packing of n circles in a square they describe is in fact optimal.

In our case, one should seek alternate convergents to $\sqrt{3} + 3/2$ which yields sequences a_k and b_k given by:

$$a_k = 2v_{k+1} - v_k, \quad b_k = 2v_k,$$

where

$$v_0 = 0, \quad v_1 = 1, \quad v_{k+2} = 4v_{k+1} - v_k, \quad k = 2, 3, \dots$$

Thus,

$$(a_1, b_1) = (7, 2), \quad (a_2, b_2) = (26, 8), \quad (a_3, b_3) = (97, 30) \dots$$

so that $N(2) = 208$, $N(3) = 2910$, etc. No such $N(k)$ for $k = 2, 3, \dots$ is indeed found to be irregular in our experiments. The best packing found experimentally for such an $N(k)$ has $h = b_k$ alternating rows of full length $w = a_k$ with $h_- = 0$, $s = 0$, in the notation of Section 4 and Tables 4.1 and 4.2.

References

- [Ft] L. Fejes-Toth, Lagerungen in der Ebene, auf der Kugel und im Raum, *Springer-Verlag*, Berlin, 1953, 197 pp.
- [FG] J. H. Folkman and R. L. Graham, A packing inequality for compact convex subsets of the plane, *Canad. Math. Bull.* **12** (1969), 745–752.

- [Füredi] Z. Füredi, The densest packing of equal circles into a parallel strip. *Discr. Comp. Geom.* **6** (1991), no. 2, 95–106.
- [GL] R. .L. Graham and B. D. Lubachevsky, Repeated Patterns of Dense Packings of Equal Disks in a Square, *Electr. J. Combin.* **3(1)** (1996), #R16.
- [L] B. D. Lubachevsky, How to simulate billiards and similar systems, *J. Comp. Phys.* **94** (1991), 255–283.
- [NO1] K. J. Nurmela and P. R. J. Östergård, Packing up to 50 equal circles in a square, *Discr. Comp. Geom.* **18** (1997), 111-120.
- [NO2] K. J. Nurmela and P. R. J. Östergård, Optimal Packings of Equal Circles in na Square, in: *Combinatorics, Graph Theory, and Algorithms*, Vol. II, Y. Alavi, D.R. Lick, and Schwenk (eds.), New Issues Press, Kalamazoo 1999
- [NO3] K. J. Nurmela and P. R. J. Östergård, More optimal packings of equal circles in a square, *Discr. Comp. Geom.* **22** (1999), 439-457.
- [NOR] K. J. Nurmela, P. R. J. Östergård and R. aus dem Spring, Asymptotic behavior of optimal circle packings in a square, *Canad. Math. Bull.* **42** (1999), 380-385.
- [Oler] N. Oler, A finite packing problem, *Canad. Math. Bull.* **4** (1961), 153-155.
- [Ruda] M. Ruda, The packing of circles in rectangles. (Hungarian. English summary) *Magyar Tud. Akad. Mat. Fiz. Tud. Oszt., Közl.*, **19** (1970), 73–87.
- [Th] A. Thue, Über die dichteste Zussamenstellung von kongruenten Kreisen in einer Ebene, *Christiania Vid. Selsk. Skr.* no. 1 (1910), 3-9.