

## Asymptotic size of search trees for Fibonacci matchings

(Don Knuth, Stanford Computer Science Department)

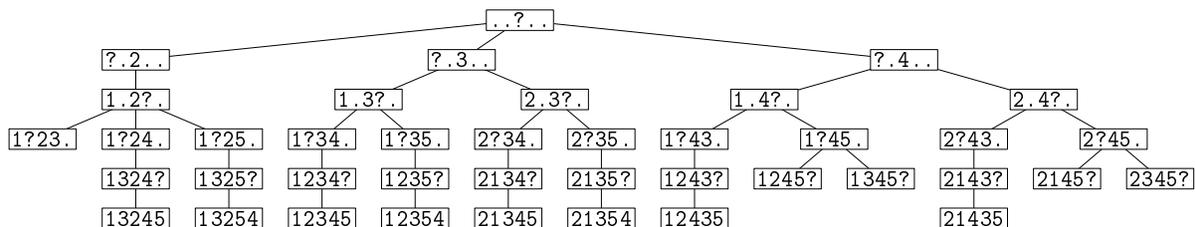
(04 February 2020; revised 05 February 2020)

I like to collect toy problems that serve as “training wheels,” because they help me to acquire mathematical tools for later use on real-world challenges. This note is a case in point, based on three problems suggested by a recent preprint of Persi Diaconis [1].

A *Fibonacci matching* is a way to match  $\{1', \dots, n'\}$  to  $\{1, \dots, n\}$  in such a way that each  $k'$  has been matched only with  $k-1$  or  $k$  or  $k+1$ . It's well known, and easy to discover, that there are exactly  $F_{n+1}$  such matchings — a Fibonacci number, hence the name. Furthermore, those matchings are in bijection with “Morse code sequences” of length  $n$ ; there's an inversion for every dash. For example, the matching that takes  $1'2'3'4'5'6'7'8'9'$  to  $132546798$  corresponds to the Morse code sequence dot-dash-dash-dot-dot-dash of length 9.

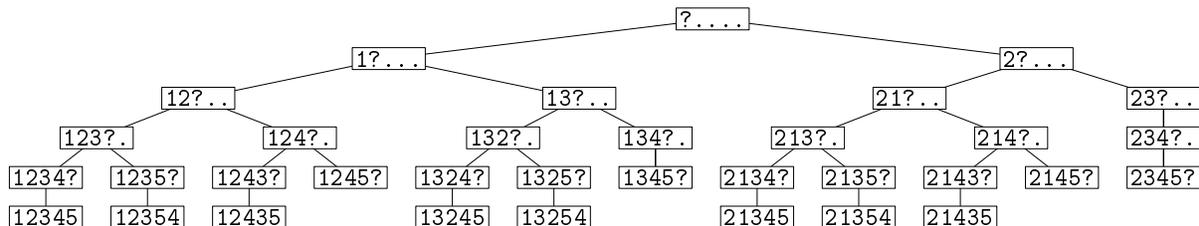
One way to find such matchings is to search exhaustively through all possibilities, assigning a mate first to  $p'_1$ , next to  $p'_2$ ,  $\dots$ , and finally to  $p'_n$ , where  $p_1 p_2 \dots p_n$  is a permutation of  $\{1, 2, \dots, n\}$ . During this process we're allowed to assign  $p'_k$  to either  $p_k - 1$  or  $p_k$  or  $p_k + 1$ , unless one of those numbers is 0, or  $n + 1$ , or already assigned to  $p'_1, \dots$ , or already assigned to  $p'_{k-1}$ . This leads to a tree of partial matchings, with at most three branches at every node.

For example, here's how that search tree looks when  $n = 5$  and  $p_1 p_2 p_3 p_4 p_5 = 31425$ :



Level  $k$  of this tree, for  $k \geq 0$ , contains the nodes that represent partial matchings of size  $k$  — one for each way to assign mates to  $p'_1$  through  $p'_{k-1}$ . Those mates are named explicitly, with dots in the unassigned positions. However, if  $k < n$  there's a question mark in position  $p_{k+1}$ , instead of a dot. (Notice that there may not be any available mate remaining for  $p_{k+1}$ , as in the case '1?23.'; such a node has no descendants.)

**Toy problem 1.** What is the search tree size when  $p_1 p_2 \dots p_n = 12 \dots n$ ? The tree for  $n = 5$  makes it clear that left-to-right assignment is easy to analyze quantitatively:

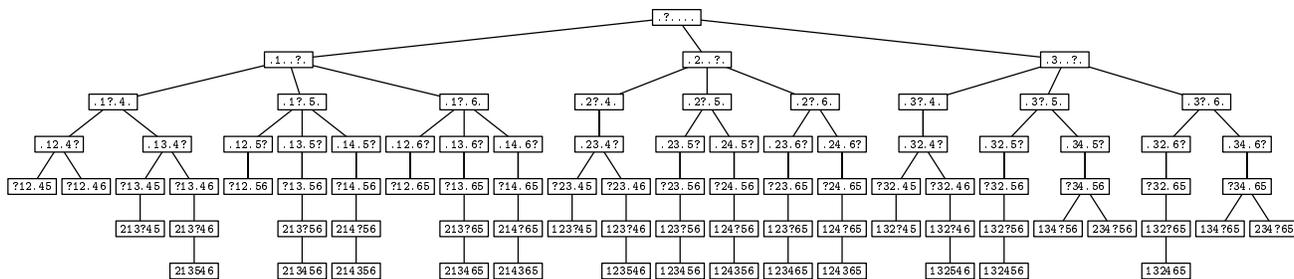


Level  $k$  now contains  $F_{k+1}$  nodes with all assignments  $\leq k$ . There also are  $F_{k+2} - 1$  additional nodes, if  $k < n$ , of which  $F_{k+1} - 1$  end with ' $k(k+1)?$ '. (Classify the nodes as type A, ‘fresh’; type B, ‘critical’; type C, ‘doomed’. The root is type A. The children of type A are types A and B. The children of type B are types A and C, except only A at the bottom. Nodes of type C have a single child, of type C, except at the bottom.)

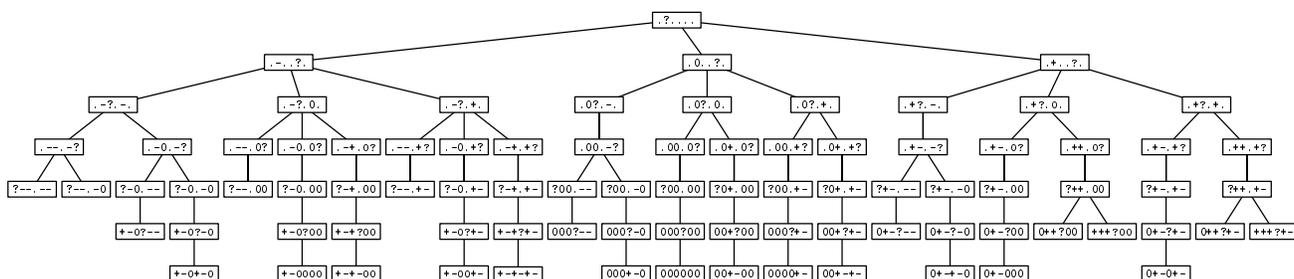
Thus there are  $F_{n+4} - n - 3$  partial matchings altogether, on levels less than  $n$ . The bottom level adds  $F_{n+1}$  further nodes, which represent the *total* matchings.

**Toy problem 2.** What is the search tree size when  $n = 3m$  and  $p_1 p_2 \dots p_n$  is the “skip-by-three” permutation  $25 \dots (3m-1)36 \dots (3m)14 \dots (3m-2)$ ? (This permutation starts with  $m$  three-way branches; the next  $m$  branches will be ternary, binary, or unary.)

Here, for example, is the case  $m = 2, n = 6$ :



The pattern is clearer, however, if we replace  $(k-1, k, k+1)$  in position  $k$  respectively by  $(-, 0, +)$ :



(Zoom if you can't read it.) Level  $k$  clearly contains  $3^k$  nodes, for  $0 \leq k \leq m$ .

Levels  $m + 1$  through  $2m$  are more interesting. For these we define auxiliary sequences

$$A_0 = B_0 = 1; \quad A_{n+1} = 2A_n + 2B_n; \quad B_{n+1} = 3A_n + 4B_n.$$

Since the generating functions  $A(z) = \sum_n A_n z^n$  and  $B(z) = \sum_n B_n z^n$  satisfy  $A(z) = 1 + z(2A(z) + 2B(z))$  and  $B(z) = 1 + z(3A(z) + 4B(z))$ , we find  $A(z) = (1 - 2z)/(1 - 6z + 2z^2)$  and  $B(z) = (1 + z)/(1 - 6z + 2z^2)$ . Hence the growth rate is the largest zero of  $x^2 - 6x + 2 = 0$ , namely  $3 + \sqrt{7} \approx 5.6457$ . Let  $U(z) = \sum_n U_n z^n = 1/(1 - 6z + 2z^2)$ . The first few values are

$n$	0	1	2	3	4	5	6	7	8	9	10	11	12
$A_n$	1	4	22	124	700	3952	22312	125968	711184	4015168	22668640	127981504	722551744
$B_n$	1	7	40	226	1276	7204	40672	229624	1296400	7319152	41322112	233294368	1317121984
$U_n$	1	6	34	192	1084	6120	34552	195072	1101328	6217824	35104288	198190080	1118931904

[Incidentally, the OEIS currently has  $\langle U_n \rangle$  in A154244,  $\langle B_n \rangle$  in A180034. Its definition of A180034 is somewhat strange. I guess I'll submit  $\langle A_n \rangle$ , and contribute some brief amendments to the others.]

If  $m > 1$ , level  $m + 1$  contains  $A_1$  nodes below nodes that have ‘-’ in position 5, but  $B_1$  nodes below the others; total  $(A_1 + 2B_1)3^{m-2} = U_1 3^{m-1}$ .

If  $m > 2$ , level  $m + 2$  contains  $A_2$  nodes below nodes that have ‘-’ in position 8, but  $B_2$  nodes below the others; total  $(A_2 + 2B_2)3^{m-3} = U_2 3^{m-2}$ .

And so on: If  $m > k$ , level  $m + k$  contains  $A_k$  nodes below nodes that have ‘-’ in position  $3k + 2$ , but  $B_k$  nodes below the others; total  $(A_k + 2B_k)3^{m-k-1} = U_k 3^{m-k}$ .

That takes us up through level  $2m - 1$ . Level  $2m$  is almost like its predecessor; but the nodes ending with ‘-’ in position  $n - 1$  have two children, while other nodes have just one. There are  $A_{m-1}$  nodes of the former kind. Hence the total number of nodes on level  $2m$  is  $3U_{m-1} + A_{m-1} = A_m = U_m - 2U_{m-1}$ .

Finally, what about levels  $2m + 1$  through  $3m$ ? That's where “bad” choices finally cause lines to die out, until eventually only  $F_{n+1}$  perfect matchings remain. On the other hand, some nodes still do branch (temporarily) into two lines in this third phase.

One can show by induction that the  $A_m$  nodes on level  $2m$  include exactly  $U_{m-1}$  that begin with ‘+’, as well as exactly  $U_{m-1}$  that begin with ‘-’.

Using that fact, we can show that, for  $0 < k \leq m$ , the number of nodes on level  $2m + k$  that put ‘-’ in position  $3k - 2$  is  $2F_{3k-3}U_{m-k}$ . The number that put ‘0’ there is  $2F_{3k-2}U_{m-k}$ . And the number that put ‘+’ there is  $F_{3k-2}A_{m-k}$  if followed by ‘-0’,  $2F_{3k-2}U_{m-k-1}$  if followed by ‘-+’, and  $2(F_{3k} - 1)U_{m-k-1}$  if followed by ‘++’. Summing these gives a total of  $F_{3k+1}U_{m-k} + 2(F_{3k} - 1)U_{m-k-1}$ . (Notice that this nicely gives  $F_{n+1}$  when  $k = m$ , because  $U_{-1} = 0$ .)

As the level increases from  $m$  to  $2m$ , the number of nodes per level rises exponentially, by a factor of roughly  $(3 + \sqrt{7})/3$ . Then, between levels  $2m$  and  $3m$ , it falls exponentially, by a factor of roughly  $\phi^3/(3 + \sqrt{7})$ . Hence the total number of nodes is asymptotically proportional to the size of level  $2m$ , namely  $\Theta((3 + \sqrt{7})^m) = \Theta(\alpha^n)$ , where  $\alpha = (3 + \sqrt{7})^{1/3} \approx 1.78063$ .

**Toy problem 3.** What is the average search tree size, averaged over all  $n!$  permutations  $p_1 p_2 \dots p_n$ ?

This problem is significantly more difficult, so I eventually asked for help. First, however, I found it reasonably easy to count the number  $a_{n,k}$  of partial matchings of size  $k$ : Exactly  $a_{n-1,k}$  of them leave  $n'$  and  $n$  unmatched. Exactly  $a_{n-1,k-1} + a_{n-2,k-2}$  of them leave  $n'$  and  $n$  matched (either to each other or to their other neighbors). Then several cases arise if  $n'$  is matched but not  $n$ : Exactly  $a_{n-2,k-1}$  of them end with ‘.-’. Exactly  $a_{n-3,k-2}$  of them end with ‘.--’. And so on. (Note that  $a_{n-k,0} = 1$ ; it counts the partial  $k$ -matching that ends with  $k$  minus signs.) Finally, by symmetry, there are just as many cases where  $n$  is matched but not  $n'$ . Hence the generating function  $A(q, z) = \sum_{k,n} a_{n,k} q^k z^n$  satisfies

$$A(q, z) = 1 + (z + qz + q^2 z^2 + 2qz^2/(1 - qz))A(q, z).$$

We have therefore

$$A(q, z) = \frac{1 - qz}{1 - z - 2qz - qz^2 + q^3 z^3} = 1 + (1+q)z + (1+4q+2q)z^2 + (1+7q+11q+3q)z^3 + \dots$$

After finding these formulas and computing the sequence of sums  $\sum_k a_{n,k}$ , namely (1, 2, 7, 22, 71, 228, 733, ...), I naturally decided to look it up in the OEIS. That sequence turns out to be A030186, which is in fact a gold mine of information — because the problem of partial Fibonacci matchings happens to be the same as the problem of placing  $k$  dominoes on a  $2 \times n$  chessboard (matching black squares to white neighbors)! Thus I learned that this recurrence for  $a_{n,k}$  was first found by McQuistan and Lichtman in 1970 [2], who gave a table of  $a_{n,k}$  for  $0 \leq k \leq n \leq 10$  and showed that  $a_{n,k}$  is maximized when  $k \approx .606n$ .

But these numbers  $a_{n,k}$ , interesting as they are, aren’t the answer to the problem. Each of the  $a_{n,k}$  partial matchings occurs exactly  $k!(n - k)!$  times among the  $n!$  search trees, because it occurs in the trees for precisely those permutations  $p_1 p_2 \dots p_n$  whose first  $k$  elements are matched.

Thus the average number of nodes on level  $k$  is  $a_{n,k} / \binom{n}{k}$ . And the answer to toy problem 3, call it  $a_n$ , is the sum of those numbers for  $0 \leq k \leq n$ . For example, we have  $(a_0, a_1, a_2, a_3, a_4, a_5) = (1, 2, 5, 10, \frac{119}{6}, \frac{189}{5})$ .

At this point I wrote to Ira Gessel, asking for suggestions about what to do. And he replied immediately [3] by reminding me about the Beta function, namely

$$B(k + 1, n - k + 1) = \int_0^1 t^k (1 - t)^{n-k} dt = \frac{\Gamma(k + 1) \Gamma(n - k + 1)}{\Gamma(n + 2)} = \frac{k! (n - k)!}{(n + 1)!}.$$

Aha! It follows that

$$\sum_{k,n} \frac{k! (n - k)!}{(n + 1)!} a_{n,k} q^k z^n = \int_0^1 A\left(\frac{tz}{(1 - t)}, (1 - t)z\right) dt = \int_0^1 \frac{(1 - tqz) dt}{1 - (1 - t)z - 2tqz - (1 - t)tqz^2 + t^3 q^3 z^3}.$$

Setting  $q = 1$  gives us a decent generating function for the answer:

$$\frac{a_0}{1} + \frac{a_1}{2}z + \frac{a_2}{3}z^2 + \dots = G(z) = \int_0^1 \frac{1 - t}{1 - (1 + t)z - (1 - t)tz^2 + t^3 z^3} dt.$$

But now what? We want to know the asymptotic behavior of the coefficients of  $G(z)$ . Ira observed that the discriminant of the denominator polynomial  $p(t, z)$  with respect to  $t$  is  $4z^6(z^3 + z^2 + 18z - 11)$ ; the nonzero points where this vanishes are where  $p(t, z) = (t - r_1(z))(t - r_2(z))(t - r_3(z))$  has a double root. Such points are probably singularities of  $G(z)$ , so they may well be key to an asymptotic analysis.

Indeed, the roots of  $z^3 + z^2 + 18z - 11 = 0$  are the reciprocals of the roots of  $11z^3 = 18z^2 + z + 1$ . That equation has one real root  $r \approx 1.7199502092911808681$ ; and it also has complex roots  $\approx -0.04179 \pm 0.22607i$  of negligible magnitude  $\approx 0.23$ . The values of  $a_n$  for  $n \leq 100$  are consistent with an asymptotic growth rate of roughly  $r^n$ . So the answer we seek almost certainly comes from a singularity at  $z = 1/r$ .

How can it be proved rigorously? This time I wrote to Philippe Jacquet for help. Sure enough, he soon came through with an explanation [4] of how to deal with generating functions of this type. By studying the behavior of  $p(t, z)$  for  $0 \leq t \leq 1$  when  $z$  is near  $1/r$ , using a bivariate Taylor expansion, he proved that  $G(z)$  has a quadratic singularity there. More precisely, there's an asymptotic expansion

$$G(z) = \frac{\gamma_{-1}}{\sqrt{1/r - z}} + \gamma_0 + \gamma_1 \sqrt{1/r - z} + \gamma_2(1/r - z) + \gamma_3(1/r - z)^{3/2} + \gamma_4(1/r - z)^2 + \dots,$$

where the coefficients  $\gamma_m$  are expressible as complicated functions of  $r$ .

Now we're essentially done, because  $[z^n](1/r - z)^\alpha = r^{n-\alpha}[z^n](1 - z)^\alpha$ ; and

$$[z^n](1 - z)^\alpha \sim \frac{n^{-\alpha-1}}{\Gamma(\alpha)} \left( 1 + \frac{\alpha(\alpha + 1)}{2n} + \frac{\alpha(\alpha + 1)(\alpha + 2)(3\alpha + 1)}{24n^2} + \dots \right)$$

by Eq. (2.2) in [5].

Consequently  $a_n = c\sqrt{n}r^n(1 + O(1/n))$ , where  $c$  is a constant.

I could find an exact expression for  $c$  if I had time; but I've got other commitments at the moment. Empirically,  $c \approx 1.14$ . (In the neighborhood of  $n = 1000$ ,  $a_n \approx 1.1401\sqrt{n} \cdot r^n(1 + .55/n + O(1/n^2))$ . The value of  $a_{1000}$ , to about seventeen decimal places, is  $1.1830684781516635 \times 10^{237}$ .)

**Extremes.** Does the permutation in problem 1 minimize the search tree size? Does the permutation in problem 2 maximize it? I leave those questions to the reader.

[1] <http://www.statweb.stanford.edu/~cgates/PERSI/papers/sequential-importance-sampling.pdf>: Persi Diaconis, "Sequential importance sampling for estimating the number of perfect matchings in bipartite graphs: An ongoing conversation with Laci," (2018).

[2] R. B. McQuistan and S. J. Lichtman, "Exact recursion relation for  $2 \times N$  arrays of dumbbells," *Journal of Mathematical Physics* **10** (1970), 3095–3099.

[3] Ira Gessel, personal communications (27 and 28 December 2019).

[4] Philippe Jacquet, "Knuth problem 2020," unpublished notes (received 24 January 2020).

[5] Philippe Flajolet and Andrew Odlyzko, "Singularity analysis of generating functions," *SIAM Journal on Discrete Mathematics* **3** (1990), 216–240.