

# An Implementation of Orrick's Algorithm

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Reference: *The maximal  $\{-1, 1\}$ -determinant of order 15*, Will Orrick, *Metrika* (2005), extended version on arXiv:math/0401179v1.

Brute force approach:

- Stage 1: Find a candidate Gram matrix  $M$  (this talk).
- Stage 2: Try to decompose  $M$  into  $RR^T$  or  $R^T R$  (RPB's talk).

# Candidate Gram matrix

- 1 must be symmetric and positive definite
- 2  $M_{i,i} = n$
- 3  $M_{i,j} \equiv n \pmod{4}$  for  $i \neq j$ ,  $|M_{i,j}| \leq n - 2$
- 4  $\det(M) = d^2$
- 5  $d \geq d_{\min}$

Remark: since  $d$  has a factor  $2^{n-1}$  we often omit this factor.

# Orrick's Algorithm (sketch)

1. start from the sub-matrix  $M = (n)$
2. at each step, for each possible matrix  $M_{r-1}$  of order  $r - 1$ , and each **admissible** vector  $f$ , construct the matrix

$$M_r = \begin{pmatrix} M_{r-1} & f \\ f^T & n \end{pmatrix}$$

3. if  $r = n$ , check  $\det M_r = d^2 \geq d_{\min}^2$  and check  $M_r$  is **lexicographically maximal**. If yes print the candidate matrix.
4. if  $r < n$ , evaluate

$$d = \begin{vmatrix} M_r & \gamma \\ \gamma^T & 1 \end{vmatrix}$$

for each possible vector  $\gamma$ , until we find a large enough  $d$ . **If no good  $d$  is found,  $M_r$  is discarded.** Otherwise continue.

# Lexicographically maximal matrix

Lexicographically maximal matrix:

$$\begin{pmatrix} 11 & 3 & 3 \\ 3 & 11 & -1 \\ 3 & -1 & 11 \end{pmatrix}$$

Equivalent non-lexicographically maximal matrix:

$$\begin{pmatrix} 11 & 3 & -1 \\ 3 & 11 & 3 \\ -1 & 3 & 11 \end{pmatrix}$$

Discarding non-lexicographically maximal sub-matrices is crucial (especially at small depth  $r < n$ ).

But it might be expensive: up to  $n!$  permutations to try!

# Block structure

$$\begin{pmatrix} 11 & 3 & 3 & -1 & -1 \\ 3 & 11 & -1 & -1 & -1 \\ 3 & -1 & 11 & -1 & -1 \\ -1 & -1 & -1 & 11 & 3 \\ -1 & -1 & -1 & 3 & 11 \end{pmatrix}$$

$$\begin{pmatrix} 11 & 3 & 3 & & \\ 3 & 11 & -1 & & \\ 3 & -1 & 11 & & \\ & & & 11 & 3 \\ & & & 3 & 11 \end{pmatrix}$$

In a given block, the largest (absolute) non-diagonal element must appear in (2, 1) position:

$$\begin{pmatrix} 11 & -9 & 3 & & \\ -9 & 11 & -1 & & \\ 3 & -1 & 11 & & \\ & & & 11 & 7 \\ & & & 7 & 11 \end{pmatrix}$$

Also, that largest non-diagonal element cannot increase from one block to the next one.

The following matrix is lexicographically maximal:

$$\begin{pmatrix} 11 & -9 & & & \\ -9 & 11 & & & \\ & & 11 & 7 & 3 \\ & & 7 & 11 & -1 \\ & & 3 & -1 & 11 \end{pmatrix}$$

The following is not:

$$\begin{pmatrix} 11 & -9 & & & \\ -9 & 11 & & & \\ & & 11 & -9 & 3 \\ & & -9 & 11 & -1 \\ & & 3 & -1 & 11 \end{pmatrix}$$



Step 4 implements the theorem of Moysiadis and Kounias:

## Theorem

*Let  $M = \begin{pmatrix} D_r & B \\ B^T & A \end{pmatrix}$  be a symmetric, positive definite matrix of order  $m$ , with  $|M_{i,j}| \geq c$ , where  $D_r$  is a square matrix of order  $r$ ,  $A_{i,j} = n$ , and the columns of  $B$  are taken from some set  $\Gamma$ , with  $|B_{i,j}| \geq c$ . Then*

$$\det M \leq (n - c)^{m-r-1} [(n - c)\det D_r + (m - r)\max(0, d)].$$

## Vectors $f$ in step 2

Due to the lexicographic condition, an appended vector  $f$  cannot have an element larger than the previous one:

$$\begin{pmatrix} 11 & 7 & -9 \\ 7 & 11 & -1 \\ -9 & -1 & 11 \end{pmatrix}$$

If  $f$  has only minimal elements, we start a new block:

$$\begin{pmatrix} 11 & 7 & -1 \\ 7 & 11 & -1 \\ -1 & -1 & 11 \end{pmatrix}$$

Our C program `algo2.c` is about 2000 lines long:

- rank-1 updates for the determinants and inverse matrices
- uses the GMP library to avoid rounding errors in determinants and inverse matrices (except in Step 4, but uses a priori rigorous bound of the rounding error)
- uses integer arithmetic in the bound computation to avoid rounding errors
- compute equivalent classes where two rows/columns are equivalent if permuting them does not change the (sub)matrix
- for the `IsLexMax` test, first try a transposition between two rows/columns, then uses equivalent classes, and try up to 50000 permutations
- we did not implement a full `IsLexMax` test, thus the program may return two equivalent matrices (but does not miss matrices, up to bugs)
- implements Will's new bound for  $n = 3 \bmod 4$

```
patate% time ./algo2 15 418037760
...
#1: det^(1/2)/2^14=26244 641ms:
#2: det^(1/2)/2^14=26244 641ms:
#3: det^(1/2)/2^14=25515 6143ms:
#4: det^(1/2)/2^14=25515 9963ms:
...
# Total cputime = 25533ms (det=15523ms (dbl=9066ms), IsLexMax=4289ms)
```

#1:  $\det^{1/2}/2^{14}=26244$  641ms:

```
[15, 3, 3, -1, -1, -1, -1, -1, -1, -1, -1, -1, -1, -1, -1],  
[ 3, 15, 3, -1, -1, -1, -1, -1, -1, -1, -1, -1, -1, -1, -1],  
[ 3, 3, 15, -1, -1, -1, -1, -1, -1, -1, -1, -1, -1, -1, -1],  
[-1, -1, -1, 15, 3, 3, -1, -1, -1, -1, -1, -1, -1, -1, -1],  
[-1, -1, -1, 3, 15, 3, -1, -1, -1, -1, -1, -1, -1, -1, -1],  
[-1, -1, -1, 3, 3, 15, -1, -1, -1, -1, -1, -1, -1, -1, -1],  
[-1, -1, -1, -1, -1, -1, 15, 3, 3, -1, -1, -1, -1, -1, -1],  
[-1, -1, -1, -1, -1, -1, 3, 15, 3, -1, -1, -1, -1, -1, -1],  
[-1, -1, -1, -1, -1, -1, 3, 3, 15, -1, -1, -1, -1, -1, -1],  
[-1, -1, -1, -1, -1, -1, -1, -1, -1, 15, 3, 3, -1, -1, -1],  
[-1, -1, -1, -1, -1, -1, -1, -1, -1, 3, 15, 3, -1, -1, -1],  
[-1, -1, -1, -1, -1, -1, -1, -1, -1, 3, 3, 15, -1, -1, -1],  
[-1, -1, -1, -1, -1, -1, -1, -1, -1, -1, -1, -1, 15, 3, -1],  
[-1, -1, -1, -1, -1, -1, -1, -1, -1, -1, -1, -1, 3, 15, -1],  
[-1, -1, -1, -1, -1, -1, -1, -1, -1, -1, -1, -1, -1, -1, 15]
```



For  $n = 15$ ,  $d_{\min} = 25515 = 105 \cdot 3^5$ , our C program finds 4 candidate matrices in about 26 seconds.

In 2004, using Mathematica, Will Orrick needed 7 hours.

The speedup is about 1000.

# $n = 15$ : statistics

```
# Det. tests 2233, square tests = 4/199 (2.01%)
# Step 4 calls 592496, aver. len 84.19, aver. comp. 76.12
# r=2: calls 7, failures 3, aver. len 49.00, aver. comp. 21.57
# r=3: calls 30, failures 8, aver. len 43.33, aver. comp. 16.57
# r=4: calls 228, failures 109, aver. len 85.52, aver. comp. 53.18
# r=5: calls 1603, failures 994, aver. len 110.56, aver. comp. 79.91
# r=6: calls 8068, failures 5419, aver. len 127.02, aver. comp. 92.63
# r=7: calls 39564, failures 30371, aver. len 149.42, aver. comp. 121.34
# r=8: calls 131475, failures 112224, aver. len 154.11, aver. comp. 139.2
# r=9: calls 188712, failures 165758, aver. len 84.15, aver. comp. 78.94
# r=10: calls 133090, failures 116720, aver. len 39.49, aver. comp. 37.44
# r=11: calls 58064, failures 51094, aver. len 18.13, aver. comp. 16.85
# r=12: calls 18042, failures 13649, aver. len 11.53, aver. comp. 10.18
# r=13: calls 7779, failures 4057, aver. len 7.22, aver. comp. 5.08
# r=14: calls 5834, failures 4282, aver. len 5.76, aver. comp. 4.70
# Total number of traversed nodes: Step 2=63249, Step 4=592496
# det(M)>0 in Step 4: 592496 nodes
# old test passed in Step 4: 87808 nodes
# Will's improved bound excluded 3032/3076 nodes
```



Ehlich's bound is  $\approx 854 \cdot 4^6$ .

Tried  $833 \cdot 4^6$ , found 9 candidate Gram matrices (computation done by Richard using 50 parallel jobs in about 900 hours).

More results in RPB's talk.

Ehlich's bound is  $\approx 45506 \cdot 5^6$ .

Partial search on  $45000 \cdot 5^6$ , found no matrix so far.

Richard started a parallel search on  $42411 \cdot 5^6$  (where one decomposable matrix is known) found 278 matrices after 130 hours.

Ehlich's bound is  $\approx 564 \cdot 6^{11}$ .

Partial search on  $560 \cdot 6^{11}$ , found no matrix so far.

$546 \cdot 6^{11}$ : one decomposable matrix known.

Complete search on  $330 \cdot 7^{12}$ : RPB found 5962 matrices in 542 hours (wall clock time).

$329 \cdot 7^{12}$ : RPB found 9587 matrices in 2800 hours (incomplete search).

$320 \cdot 7^{12}$ : one decomposable matrix known.

Complete search on  $471 \cdot 8^{14}$ : RPB found 9054 matrices.

$464 \cdot 8^{14}$ : RPB found 86279 matrices (incomplete search, estimated 50% done).

$441 \cdot 8^{14}$ : one decomposable matrix known.

Complete search on  $648 \cdot 9^{16}$ : found 807 matrices in 78 hours.

More results in RPB's talk.

Complete search on  $99 \cdot 11^{21}$ : found 1495 matrices in 335 hours.

$89 \cdot 11^{21}$ : new record from Will (August 2009).

$83 \cdot 11^{21}$ : old record.

Complete search on  $114 \cdot 12^{23}$ : found 168 matrices.

$96 \cdot 12^{23}$ : current record.



Complete search on  $129 \cdot 13^{25}$ : found 220 matrices.

$105 \cdot 13^{25}$ : current record.

Complete search on  $145 \cdot 14^{27}$ : found 128 matrices.

$142 \cdot 14^{27}$ : conjectured maxdet.

$133 \cdot 14^{27}$ : current record.

# How to speed-up the search?

- run the search in parallel: already tried (RPB). We could however implement a checkpoint mechanism.
- if only **one** solution is enough, we could try a randomized search (works well for the decomposition). At each node of the search tree, go down in a random branch. At the bottom of the tree, do backtracking.
- search only for matrices with bounded block size (already implemented).

# Bounded block-size for $n = 15$

Using  $d_{\min} = 105 \cdot 3^5$ :

No bound: 4 matrices in 25.5s.

Bound 3: 2 matrices in 0.018s (both  $108 \cdot 3^5$ ).

Bound 4: 3 matrices in 0.156s.

Bound 5: 3 matrices in 0.799s.

Bound 6: 4 matrices in 3.183s.

# Bounded block-size for $n = 19$

Using  $d_{\min} = 833 \cdot 4^6$ :

No bound: 9 matrices in 188 hours.

Bound 4: 3 matrices in 3.2s.

Bound 5: 4 matrices in 41s.

Bound 6: 6 matrices in 513s.

Bound 7:  $\geq 7$  matrices in  $\geq 800$ s.

# Bounded block-size for $n = 57$

Using  $d_{\min} = 142 \cdot 14^{27}$  (conjectured maxdet):

Bound 2: 2 matrices in 12s (144.50 and 142.02).

Bound 3: 17 matrices in 53 minutes.