## Quarto!

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Cakes Talk
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## Goals of this talk

- Become a departmental celebrity.
- Serve Dutch streopwafels Belgian cookies.
- Popularise Quarto!
- Legitimise hobby project.
- Fun and empowering toolbox:
- Combinatorial game theory
- Academic programming
- Nice example of brain vs computational power:
- Thought-assisted combinatorial search
- Combinatorial-search-assisted thought
- Fascinating symmetries


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- Nice example of brain vs computational power:
- Thought-assisted combinatorial search
- Combinatorial-search-assisted thought
- Fascinating symmetries


## Outline

(1) Quarto crash course

## (2) The value of Quarto

## 3 Playing Optimally

## Rules: the pieces and Quarto

- The pieces are the 16 realisations of four binary properties:

- Four pieces form Quarto if they agree on a property.

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Q\{p, q, r, s\} \quad \text { iff } \quad p_{i}=q_{i}=r_{i}=s_{i} \quad \text { for some property } i
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## Rules: board, turns and winning

- The board has $4 \times 4$ cells. Initially empty. Pieces are put aside.
- The game proceeds in rounds. Each round has two plies:
- One player gives an unused piece to the other player.
- The other player places that piece on an empty cell.

- Win by forming Quarto in a row, column or (co)diagonal.
- Draw when all pieces placed without Quarto.


## Questions

- What is the value of the game? (i.e. when both players play optimally, does the starting player win, lose or draw?)
- How to play the optimal strategy?


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## Naive approach

$$
\max _{p_{1}} \min _{c_{1}} \min _{p_{2}} \max _{c_{2}} \max _{p_{3}} \ldots \min _{p_{16}} \max _{c_{16}} V\left(p_{1} c_{1} \cdots p_{16} c_{16}\right)
$$

where

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V\left(p_{1} c_{1} \cdots p_{16} c_{16}\right)= \begin{cases}-\infty & \text { You disobeyed the rules } \\ -1 & \text { You lose } \\ 0 & \text { Game is a draw } \\ +1 & \text { You win } \\ +\infty & \text { Opp disobeyed the rules }\end{cases}
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Way too many. Q: Any ideas?

## Exploiting positionality

In Quarto, the moves from and payoffs in any state depend only on the current position, and not on how the players got there.

```
1: function \(\operatorname{VAL}(b)\)
2: if ISQ \((b)\) return WIN
3: if \(\operatorname{ISFULL}(b)\) return DRAW
4: if we stored that \(b\) has value \(v\) then return \(v\)
5: if \(b\) has given piece \(p\) then
6: \(\quad v \leftarrow \max _{c \in c e l l s(b)} \operatorname{VAL}(b[p @ c])\)
7: else
8: \(\quad v \leftarrow \max _{p \in \text { pieces }(b)}-\operatorname{VAL}(b \oplus p)\)
9: end if
10: \(\quad\) store that \(b\) has value \(v\)
11: return \(v\)
12: end function
```

We now need $9.9 \cdot 10^{16}$ operations. Still no cigar.

## Exploiting symmetries

Some positions are equivalent. It suffices to evaluate only one member of each equivalence class.

- Piece symmetries
- Board symmetries


## Piece symmetries

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## Fact

There are $4!2^{4}=384$ piece symmetries.

- the 4 properties can be reordered arbitrarily
- the 2 values of each property can be flipped


## Board s

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A board symmetry must map rows/columns to rows/columns and (co)diagonals to (co)diagonals.

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Q: Find board symmetries

## Finding board symmetries


counter clockwise rotation

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Q: What about clockwise rotation? A: Rotate ccw thrice

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mirror over vertical axis

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Q: What about clockwise rotation? A: Rotate ccw thrice
Q: Mirror over diagonal? A: rotate cw, then mirror
Q: Are there other board symmetries?
Q: How to even approach such a question?

## Exhaustive enumeration

```
1: procedure ENUM_SYM(M)
    2: if M violates group structure then return
3: if }|M|=16\mathrm{ then
4: print M
5: else
6: choose a free source cell }
        for each free target cell }j\mathrm{ do
                ENUM_SYM(M[i->j])
            end for
10: end if
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## Fact

There are 32 board symmetries.

## Finding board symmetries (ctd)



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[Goo04] found 16 (inside out), and [Bro05] found 16(mid flip).

## Symmetry benefits

Identifying $d$ positions may divide the degree by $d$. Exponential gain.


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Q: Will it always? If not, what is the least-favourable reduction?

## Symmetry benefits ctd.



Good, but we need to explore 32 plies!

## How to exploit symmetries

CANONISE picks a canonical representative of each equivalence class.

```
    1: function VAL(b)
    2: if ISQ(b) return WIN
    3: if ISFULL(b) return DRAW
    4:}\quadb\leftarrow\mathrm{ CANONISE( }b
    5: if we stored that b}\mathrm{ has value v then return v
    6: if b}\mathrm{ has given piece p then
    7:
    8: else
    9:
10: end if
11: store that }b\mathrm{ has value }
12: return v
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```


## The final trick

Alpha-beta pruning. Rule of thumb: explores only the square root of the original number of positions.

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## Fact

The value of Quarto is draw.
Software finds out in 147 minutes on this laptop.

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## Implementing the optimal strategy

- So far, we computed the value of the empty board.
- But to play, we need to evaluate any board.
- We can evaluate positions at $\geq 10$ plies from scratch in $<5$ seconds.
- There are only 106156 distinct positions at $<10$ plies.
- Compute, once and for all, the value of all of them.
- Took about 2 weeks on this laptop.
- Now we can evaluate any position fast.
- To play, choose the child that evaluates to the value of the parent.

Kevin S. Brown.
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