## Fractional Sudoku

A coherent configuration and fractional completion threshold

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## Introduction

## Partial latin squares

A latin square of order $n$ is an $n \times n$ array with entries from $[n]:=\{1,2, \ldots, n\}$ such that each symbol appears exactly once in every row and every column.

A partial latin square of order $n$ is an $n \times n$ array whose cells are either empty or filled with one of $n$ symbols in such a way that each symbol appears at most once in every row and every column.

A completion of a partial latin square $P$ is a latin square which contains every entry of $P$.

## Examples

Here is a partial latin square and a completion of it to a latin square of order 5 .

| 1 |  |  |  |  |
| :--- | :--- | :--- | :--- | :--- |
|  | 2 | 4 |  |  |
|  |  |  | 3 |  |
|  |  |  |  |  |
|  |  |  | 1 |  |


| 1 | 3 | 5 | 2 | 4 |
| :--- | :--- | :--- | :--- | :--- |
| 3 | 2 | 4 | 5 | 1 |
| 4 | 1 | 2 | 3 | 5 |
| 2 | 5 | 1 | 4 | 3 |
| 5 | 4 | 3 | 1 | 2 |

## Barriers

We can't use any row, column, or symbol very often if we want a completion to exist:


| 1 |  |  |  |  |
| :--- | :--- | :--- | :--- | :--- |
| 2 |  |  |  |  |
| 3 |  |  |  |  |
| 4 |  |  |  |  |
|  | 5 |  |  |  |


| 1 |  |  |  |  |
| :--- | :--- | :--- | :--- | :--- |
|  | 1 |  |  |  |
|  |  | 1 |  |  |
|  |  |  | 1 |  |
|  |  |  |  | 2 |

## Barriers

We can't use any row, column, or symbol very often if we want a completion to exist:


## Completion threshold

Let us say that a partial latin square is $\epsilon$-dense if no row, column, or symbol is used more than $\epsilon$ times.

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## Theorem

For sufficiently large $n$, every $\epsilon$-dense partial latin square of order $n$ has a completion.

- Prehistory: $\epsilon \rightarrow 0$
- 1991: $\epsilon=10^{-7}$ (Gustavsson)
- 2013: $\epsilon \approx 10^{-4}$ (Bartlett)
- 2019: $\epsilon \approx 0.04$ (Bowditch \& D.)


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- 2019: $\epsilon \approx 0.04$ (Bowditch \& D.)
- Conjecture: $\epsilon=0.25$


## Sudoku

A Sudoku latin square of type ( $h, w$ ) is a latin square of order $n=h w$ divided into a $w \times h$ pattern of $h \times w$ sub-arrays (boxes), each of which contains every symbol exactly once.

A partial Sudoku is a partial latin square in which each symbol appears at most once in every box.

Completion is defined analogously as for partial latin squares.

## Stronger sparseness assumptions

| 1 | 2 | 3 |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |

## Stronger sparseness assumptions



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## Definition

Let us say that a Sudoku of type ( $h, w$ ) is $\underbrace{\epsilon \text {-dense }}$ if:

- each row, column, and box has at most $\epsilon n$ filled cells; AND
© each symbol occurs at most $\epsilon$ times in any bundle of $h$ rows corresponding to the box partition, and likewise at most $\epsilon w$ times in any bundle of $w$ columns.


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Question: Can $\epsilon$-dense Sudoku always be completed for some $\epsilon>0$ ?

The linear system

## Linear equations

Consider an $n \times n$ Sudoku. Let the rows, columns, symbols and boxes be denoted $r_{i}, c_{j}, \underline{s_{k}}, \underline{b_{\ell}}$, respectively, where $i, j, k, \ell \in[n]$.
Let $x_{i j k}$ denote the number/fraction of symbols $s_{k}$ placed in cell $(i, j)$.
Sudoku constraints correspond to linear equations on these variables:

- every cell has exactly one symbol: $\sum_{k} x_{i j k}=1$ for each $(i, j) \in[n]^{2}$.
- every row has every symbol once: $\sum_{j} x_{i j k}=1$ for each $(i, k) \in[n]^{2}$.
- " column " " $: \sum_{i} x_{i j k}=1$ for each $(j, k) \in[n]^{2}$.


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- " column " " : $\sum_{i} x_{i j k}=1$ for each $(j, k) \in[n]^{2}$.
- every box contains every symbol once:

$$
\sum_{, j) \in \operatorname{box}(\ell)} x_{i j k}=1
$$

for each $(k, \ell) \in[n]^{2}$.

## Linear system

This results in a $4 n^{2} \times n^{3}$ linear system

$$
W \overrightarrow{\mathrm{x}}=\overrightarrow{\mathbf{1}} \text { (all-ones vector). }
$$

There is a naïve solution: $\overrightarrow{\mathrm{x}}=\frac{1}{n} \overrightarrow{\mathbf{1}}$.
If some entries have been pre-filled, a similar linear system can be used. We can either adjust the right side, or delete those variables $x_{i j k}$ which are unavailable.
If we get a $\{0,1\}$ valued solution $\overrightarrow{\mathrm{x}}$, this leads to a completion of the corresponding partial Sudoku.

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If we get a $[0,1]$ valued solution $\overrightarrow{\mathrm{x}}$, this leads to a fractional completion of the corresponding partial Sudoku.

Graph decomposition model

We can think of a Sudoku as an edge-decomposition of the 4-partite graph shown below into 'tiles' $\left\{r_{i}, c_{j}, s_{k}, b_{\ell}\right\}$


## Graph decomposition model

We can think of a Sudoku as an edge-decomposition of the 4-partite graph shown below into 'tiles' $\left\{r_{i}, c_{j}, s_{k}, b_{\ell}\right\}$.
$W$ is the $\{0,1\}$ inclusion matrix of edges versus tiles.


## The normal system

Let $M=W W^{\top}$ and consider instead the normal system $M \overrightarrow{\mathbf{x}}=\overrightarrow{\mathbf{1}}$.
Rows and columns of $M$ are indexed by edges $r_{i} c_{j}, r_{i} s_{k}, c_{j} s_{k}, b_{\ell} s_{k}$. Entries tell us how many tiles contain two given edges.

That is,

$$
M(e, f)= \begin{cases}n & \text { if } e=f \\ h & \text { if } e \cup f=\left\{c_{j}, s_{k}, b_{\ell}\right\} \text { where } c_{j} \text { meets } b_{\ell} \\ w & \text { if } e \cup f=\left\{r_{i}, s_{k}, b_{\ell}\right\} \text { where } r_{i} \text { meets } b_{\ell} \\ 1 & \text { if } e \cup f \text { has exactly one of each } r_{i}, c_{j}, s_{k} \\ 0 & \text { otherwise. }\end{cases}
$$

## Coefficient matrix



## Coherent configuration

Using the symmetries present in Sudoku, we can express $M$ in an algebra of fixed dimension, independent of $h$ and $w$.

- Rows can be equal, unequal in the same bundle, or in different bundles. Same with columns.
- Boxes can be equal, row-adjacent, column-adjacent, or neither.
- Symbols can be equal or unequal.

These lead to 69 relations on edges.

## Relations



## Structure constants

We found and stored symbolic structure constants for this coherent configuration using the following procedure:

- argue that they are all polynomials of degree $\leq 2$ in each of $h, w$;
- directly compute all structure constants for the nine cases $2 \leq h, w \leq 4 ;$
- interpolate to arrive at symbolic expressions.


## Possible values

Fix two edges $e, f$ which are related in some way. In picking a third edge having prescribed relations with each of $e, f$, we multiply two of:

- row choices $\in\{0,1, h, h-1, h-2, n-h, n-2 h\} ;$
- column choices $\in\{0,1, w, w-1, w-2, n-w, n-2 w\}$;
- symbol choices $\in\{0,1, n, n-1, n-2\}$;
- box choices $\in\{0,1, h, h-1, h-2\} *\{0,1, w, w-1, w-2\}$.



## Spectral decomposition

## Summary

## Proposition

The eigenvalues of $M$ are $\theta_{j}=j n, j=0,1, \ldots, 4$. Each eigenspace has a basis of eigenvectors consisting of vectors with entries in $\{0, \pm 1\}$.

symbols


## Kernel of $M$

- $\theta_{0}=0$; kernel dimension $3 n+(h+w)(n-1)$
(A)



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## Kernel of $M$

- $\theta_{0}=0$; kernel dimension $3 n+(h+w)(n-1)$
(B)



## Kernel of $M$

- $\theta_{0}=0$; kernel dimension $3 n+(h+w)(n-1)$


## (C)



## Other eigenvalues and eigenvectors

- $\theta_{1}=n$; eigenspace dimension $4 n^{2}-(2 n-3)(h+w)-5 n-1$
(A)




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- $\theta_{1}=n$; eigenspace dimension $4 n^{2}-(2 n-3)(h+w)-5 n-1$
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(C)



## Other eigenvalues and eigenvectors

- $\theta_{2}=2 n$; eigenspace dimension $(n-3)(h+w-1)+2 n$
(A)



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- $\theta_{2}=2 n$; eigenspace dimension $(n-3)(h+w-1)+2 n$
(B)




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- $\theta_{2}=2 n$; eigenspace dimension $(n-3)(h+w-1)+2 n$
(C)



## Other eigenvalues and eigenvectors

- $\theta_{3}=3 n$; eigenspace dimension $n+h+w-3$
(A)



## Other eigenvalues and eigenvectors

- $\theta_{3}=3 n$; eigenspace dimension $n+h+w-3$
(B)



## Other eigenvalues and eigenvectors

- $\theta_{4}=4 n$; eigenspace dimension 1



## Projectors

Using orthogonal projections onto the eigenspaces, we can write

$$
M=n E_{1}+2 n E_{2}+3 n E_{3}+4 n E_{4} .
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## A generalized inverse

Let $K$ denote projection onto the kernel. For $x \in \mathbb{R}$, we can invert the additive shift $A=M+\frac{n}{x} K$ as

$$
A^{-1}=\frac{1}{n}\left(x K+\sum_{j=1}^{4} \frac{1}{j} E_{j}\right) .
$$

With the help of computer, the choice $x=3 / 2$ minimizes

$$
\left\|A^{-1}\right\|_{\infty}=\frac{15}{4 n}-\frac{7(h+w)}{8 n^{2}}-\frac{4}{9 n^{2}}+\frac{31(h+w)-21}{72 n^{3}}<\frac{15}{4 n} .
$$

## Perturbation

## Perturbed linear systems

## Lemma

Let $A$ be an $N \times N$ invertible matrix over the reals. Suppose $A-\Delta A$ is a perturbation. Then

- $A-\Delta A$ is invertible provided $\left\|A^{-1} \Delta A\right\|_{\infty}<1$; and
- the solution $\overrightarrow{\mathrm{x}}$ to $(A-\Delta A) \overrightarrow{\mathrm{x}}=A \overrightarrow{1}$ is entrywise nonnegative provided $\left\|A^{-1} \Delta A\right\|_{\infty} \leq \frac{1}{2}$.


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## Proof idea.

Use the series expansion $(A-\Delta A)^{-1}=\sum_{k=0}^{\infty}\left(A^{-1} \Delta A\right)^{k} A^{-1}$.

## A perturbation of $M$

Let $S$ be an $\epsilon$-dense partial Sudoku of type ( $h, w$ ), where $h w=n$.
Define $M_{S}$ similarly to $M$, so that $M_{S}(e, f)$ records the number of available tiles $\left\{r_{i}, c_{j}, s_{k}, b_{\ell}\right\}$ containing $e \cup f$.

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Here is a white lie*, but morally true:

## Proposition

$\left\|M-M_{S}\right\|_{\infty}<12 \epsilon n$.
*: we need to use a border to make $M_{S}$ and $M$ have the same dimensions

## Main result

## Theorem

Let $\epsilon<1 / 101$. For sufficiently large $h$ and $w$, every $\epsilon$-dense partial Sudoku of type ( $h, w$ ) has a fractional completion, that is, an assignment of positive rational frequencies to symbols in unfilled cells so that the Sudoku conditions hold.

## Main result

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## Proof sketch

We show $M_{S} \overrightarrow{\mathrm{x}}=\overrightarrow{\mathbf{1}}$ has an entrywise nonnegative solution $\overrightarrow{\mathrm{x}}$.
We shift the coefficient matrix by a multiple of $K$ and view it as a perturbation of $A$ (the 'empty' Sudoku).
Letting $\triangle A$ be this perturbation, we succeed when

$$
\left\|A^{-1} \Delta A\right\|_{\infty}<\frac{15}{4 n} \times 12 \epsilon n+\frac{11}{2} \epsilon+o(1)=\frac{101}{2} \epsilon+o(1)<\frac{1}{2} .
$$

Wrap-up

## Concluding remarks

- Some details on bordering our matrices have been suppressed for clarity.


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- If the boxes are asymptotically thin (say $w$ fixed and $n=h w$ large), then the bundle condition can be dropped.
- A structure of wiggly but 'near-rectangular' boxes can be handled via a secondary perturbation.


## Concluding remarks

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- If the boxes are asymptotically thin (say $w$ fixed and $n=h w$ large), then the bundle condition can be dropped.
- A structure of wiggly but 'near-rectangular' boxes can be handled via a secondary perturbation.
- Can this sparsity threshold for fractional completion be converted into something for actual completion?


## Thank you!

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