

Hadamard Equivalence on Binary Matrices

- new combinatorial problem

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Seoul, Korea

In this talk

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■ Introduction

- Hadamard Matrix
- Hadamard Equivalence

■ Main Results

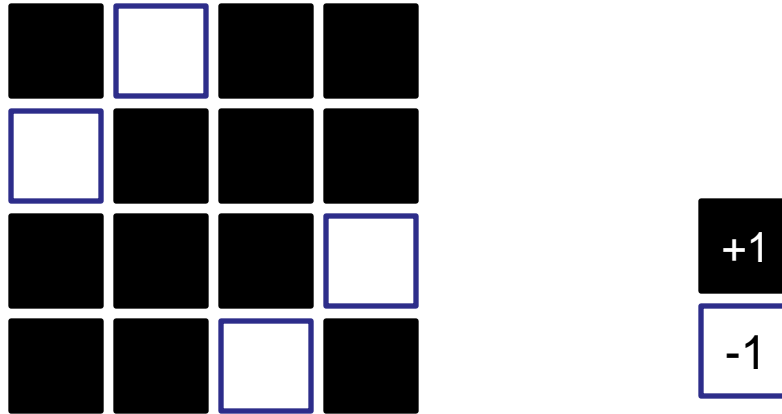
- Classification of binary matrices
- Pseudo-Hadamard matrices
- Some Theorems and a Conjecture
- Result of Exhaustive Search and More

■ Concluding Remarks

- More Conjectures and Open Problems

Hadamard Matrix

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- A Hadamard matrix of order n (or, size $n \times n$) is defined as an $n \times n$ matrix with all entries $+1$ or -1 such that

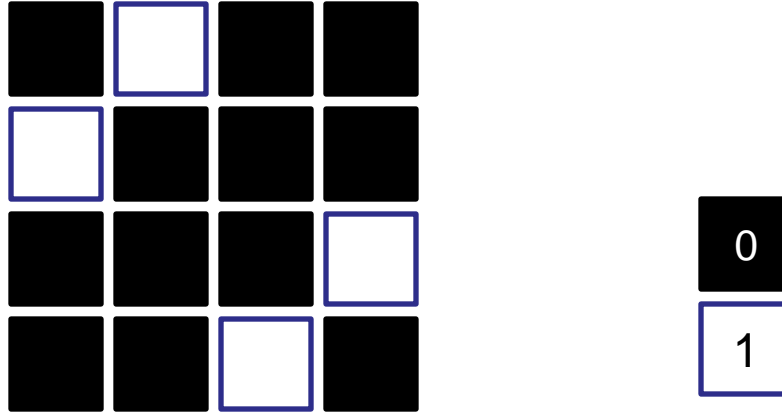
$$H H^T = n I,$$

where I is the $n \times n$ identity matrix.

- **Hadamard Conjecture:** There exists a Hadamard matrix of order every multiple of 4.

Hadamard Matrix over $\{0, 1\}$

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- A Hadamard matrix can be represented as a binary matrix over $\{0,1\}$.
- In this talk, we consider the binary matrices over $\{0,1\}$.

Studies on Hadamard Matrices

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- **Hadamard matrix is widely used in communications and signal processing engineering:**
 - Orthogonal Channelization in CDMA communication systems
 - Construction of orthogonal signals and LCZ/ZCZ signals
 - Hadamard Transform is widely used in image processing
- **Theoretical/Mathematical research on Hadamard matrices:**
 - Existence/Constructions
 - Classification/Equivalence
- **This paper is to study the classification of binary matrices in terms of Hadamard equivalence**

Hadamard Equivalence on Binary Matrices

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■ Definition 1 (Hadamard-preserving operation)

- PC/PR: Permuting columns (PC) / rows (PR)
- CC/CR: Complementing a column (CC) / a row (CR)

■ Definition 2 (Hadamard Equivalence)

Two binary matrices of the same size are said to be hadamard-equivalent if one can be converted to the other by some combinations of the hadamard-preserving operations.

■ Hadamard-equivalent binary matrices have the same correlation property (in absolute value).

- We use the alphabet $\{0,1\}$, so the correlation is calculated as the difference between the number of agreements and that of disagreements of the components.

Number of inequivalent Hadamard matrices

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Size	Number	Reference
1, 2, 4, 8, 12	1	
16	5	
20	3	
24	60	Kimura, 1989
28	487	Kimura, 1994
>32	Unknown	



Integer Representation of Binary Matrices

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- **Definition 3:** Let $A = (a_{ij})$ be an $m \times n$ binary matrix where $i = 1, 2, \dots, m$ and $j = 1, 2, \dots, n$. We define a map ρ as

$$\rho(A) \triangleq \sum_{i=1}^m \sum_{j=1}^n \left[a_{ij} 2^{n(m-i)+(n-j)} \right]$$

- **Example:**

$$\rho \begin{pmatrix} 0 & 0 & 0 & 0 \\ 0 & 0 & 1 & 1 \\ 0 & 1 & 0 & 1 \\ 0 & 1 & 1 & 0 \end{pmatrix} = \begin{matrix} 0 & 0 & 0 & 0 \\ 0 & 0 & 1 & 1 \\ 0 & 1 & 0 & 1 \\ 0 & 1 & 1 & 0 \end{matrix} \\ = 0000001101010110_{(2)} = 854.$$

- **Proposition 1:** Let A and B be two binary matrices of the same size. Then,

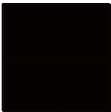
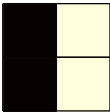
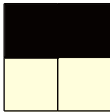
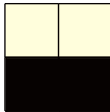
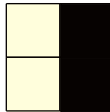
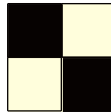
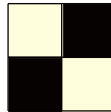
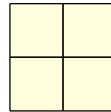

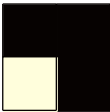
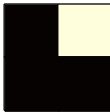
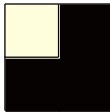
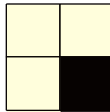
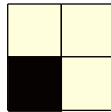
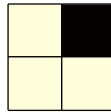
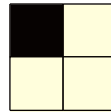
$$\rho(A) = \rho(B) \text{ if and only if } A = B.$$

Representation of equivalence Class

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■ Definition 4: (HR-minimal, HC-minimal, H-minimal)

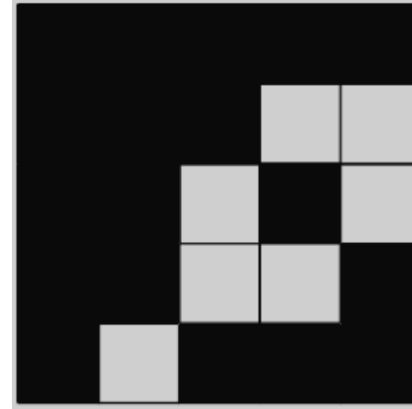
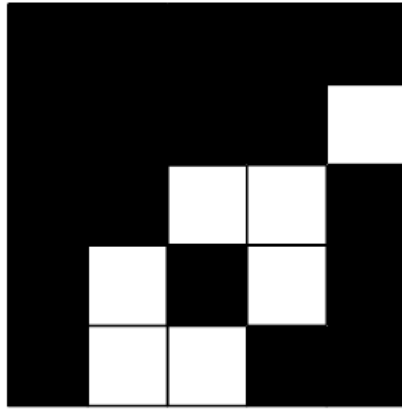
- A binary matrix A is a Hadamard-row-minimal matrix (or simply **HR-minimal**) if $\rho(A) \leq \rho(B)$ for all B which are hadamard-equivalent with A
- A binary matrix A is a Hadamard-column-minimal matrix (or simply **HC-minimal**) if A^T is an HR-minimal
- If a matrix is both HR-minimal and HC-minimal, it is a Hadamard-minimal matrix (or simply **H-minimal**)

Class A	 (0000)	 (0101)	 (0011)	 (1100)	 (1010)	 (0110)	 (1001)	 (1111)
Class B	 (0001)	 (0010)	 (0100)	 (1000)	 (1110)	 (1101)	 (1011)	 (0111)

HR-minimal and HC-minimal

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- These two matrices are hadamard-equivalent:

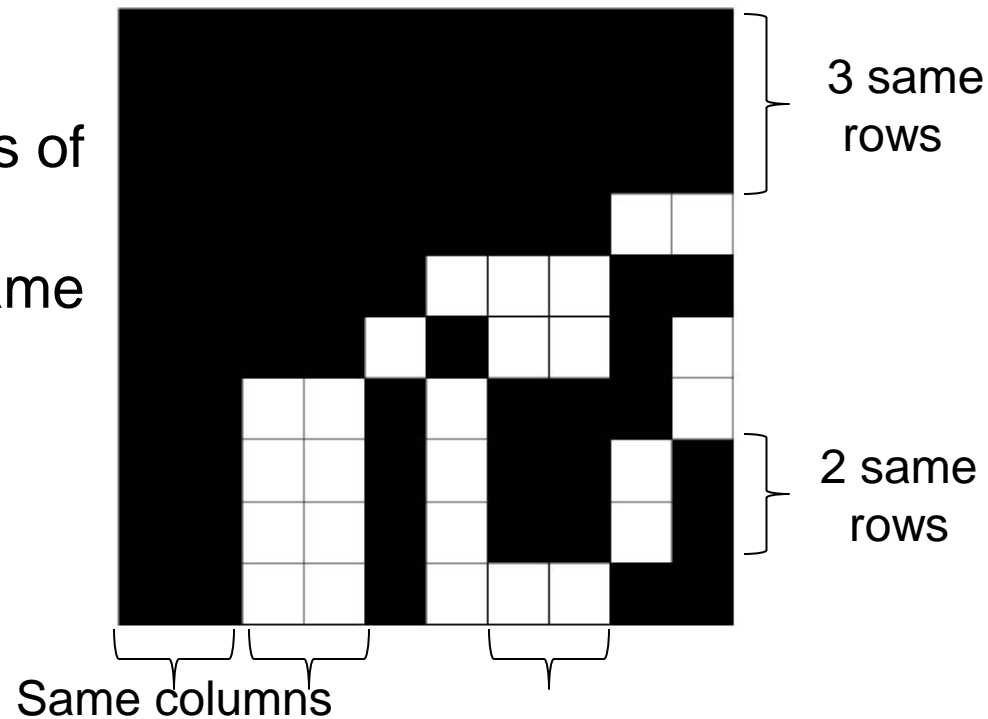


- Left one is HR-minimal but **not** HC-minimal. Note that it is column-sorted.
- An HR-minimal is not always an HC-minimal, and vice versa.
- The above shows the smallest size of the class with **no** H-minimal.

Properties of HR-minimals

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- **Proposition 2:** An HR-minimal is row-sorted, and also, column-sorted. The converse is **not** true in general.
- **Corollary 1:** Two same rows of an HR-minimal must be adjacent. So must be two same columns.

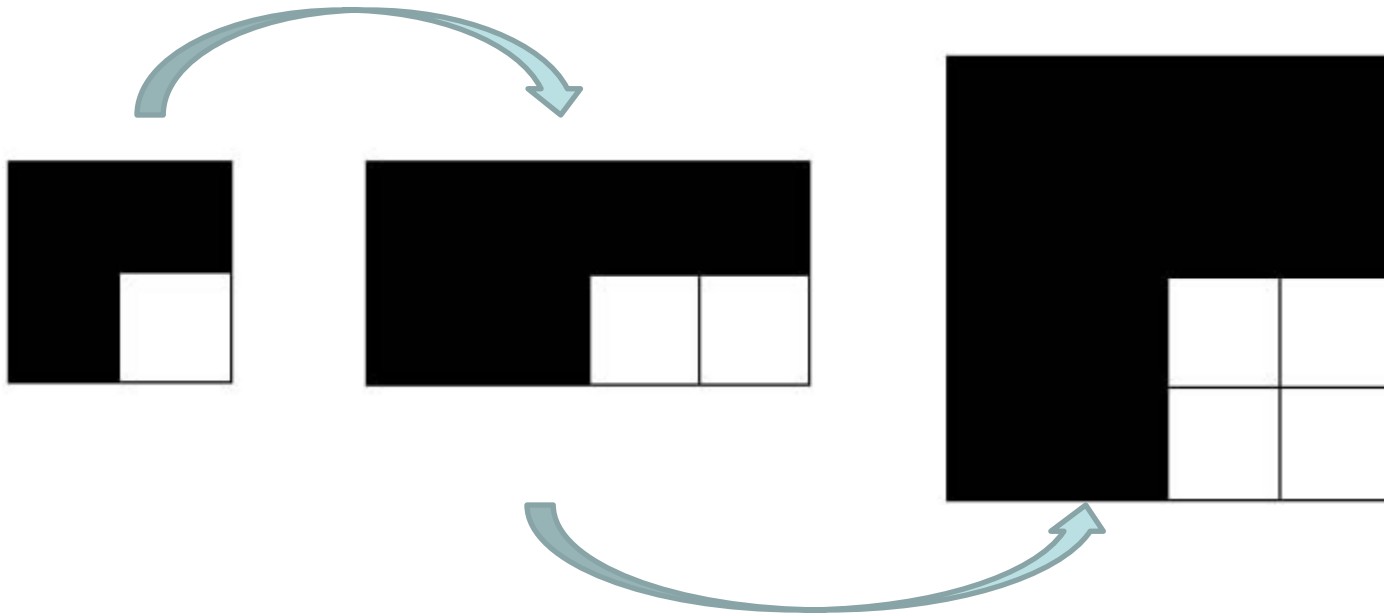


Properties of HR-minimals

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- **Theorem 1 (Linear Expanding Construction):** Let $A = (a_{ij})$ be an $m \times n$ HR-minimal, and k and l be positive integers. Then $B = (b_{ij})$ of size $km \times ln$ is also an HR-minimal, where

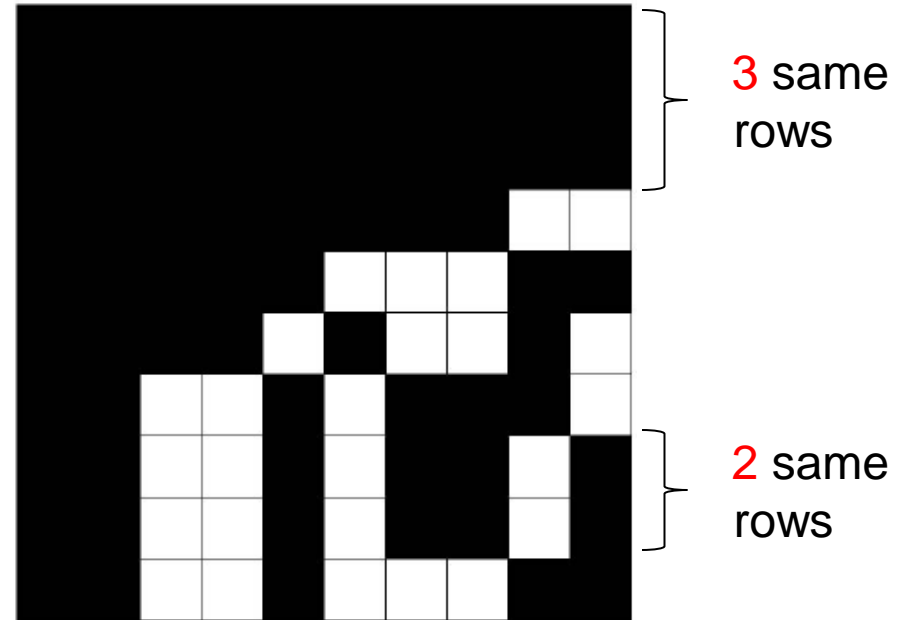
$$b_{ij} = a_{\lfloor \frac{i+k-1}{k} \rfloor \lfloor \frac{j+l-1}{l} \rfloor}$$



Properties of HR-minimals

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- **Proposition 3:** In an HR-minimal, the number of row-repetitions of any row cannot exceed that of the all-zero-row.
- **Corollary 2 (All-zero-row Adjoining Construction):** We can construct an $(m+1) \times n$ HR-minimal by adjoining the all-zero row at the top of an $m \times n$ HR-minimal.

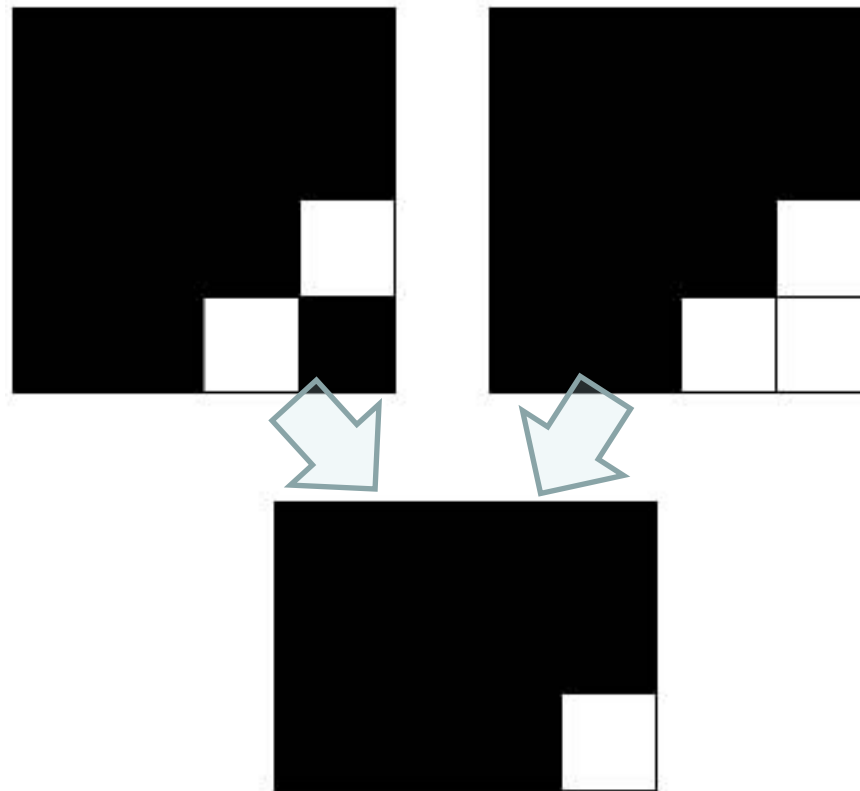


- Repeating any other row **not necessarily** preserves the HR-minimality.

Properties of HR-minimals

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- **Proposition 4:** If A is an $m \times n$ HR-minimal, then the $(m-1) \times n$ matrix obtained by deleting the bottom row of A is also an HR-minimal.



A Theorem toward Hadamard Conjecture

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Theorem 2: Fix a positive integer n and consider the set S_n of all the HR-minimals of size $n \times n$. Let $A \in S_n$. Then the following holds:

- ① The weight of the second row of A is upper bounded by:
 - a. 1 when $n = 2$,
 - b. $(n-1)/2$ when $n \equiv 1 \pmod{2}$,
 - c. $(n-2)/2$ when $n \equiv 2 \pmod{4}$ except for $n = 2$, and
 - d. $n/2$ when $n \equiv 0 \pmod{4}$.
- ② For $n \equiv 0 \pmod{4}$, if the matrix A which attains the upper bound above on the weight of its second row, then it must be a Hadamard matrix, **and conversely for the HR-minimal of any Hadamard matrix.**

Second Row of HR-minimals

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- If the weight is w , then the correlation of the top row (= all-zero-row) and itself becomes:
$$\# \text{Agreements} - \# \text{Disagreements} = n - 2w.$$
- Note that the value $|n - 2w| = C_{\max}$ is maximum (in absolute value) over the correlations of all possible pairs of rows of the HR-minimal.
- Therefore, the HR-minimal A with largest weight in its second row gives a set of row vectors with the lowest possible pairwise correlations.
- **Definition 5 (Pseudo-Hadamard Matrix)**
An $n \times n$ HR-minimal A is called as pseudo-hadamard matrix (PH matrix) of order n if the weight of its second row attains the upper bound in Theorem 2. So are all its hadamard-equivalent matrices.

Existence of PH Classes

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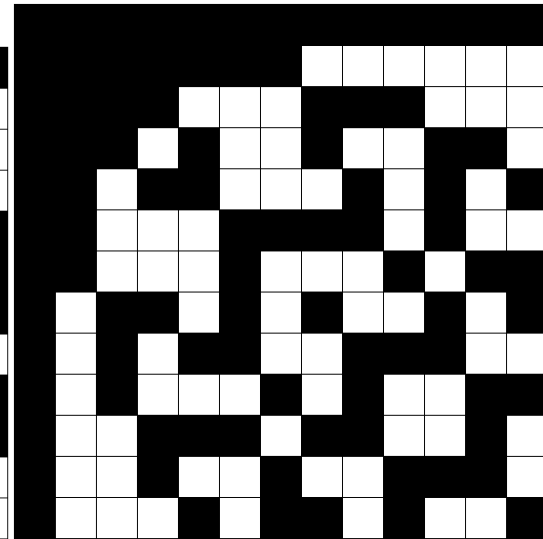
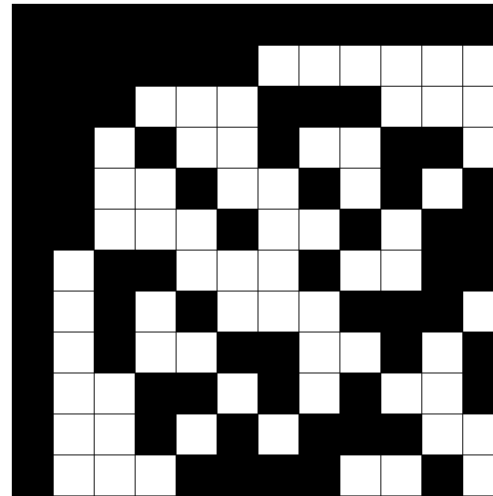
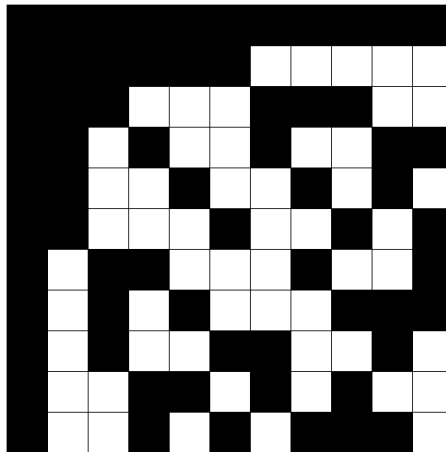
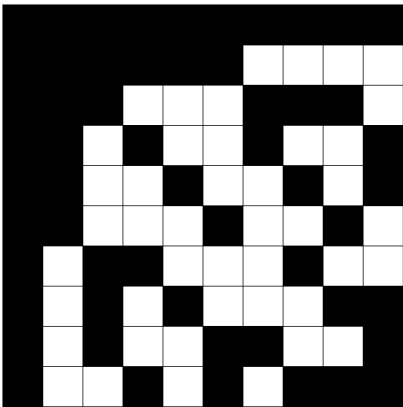
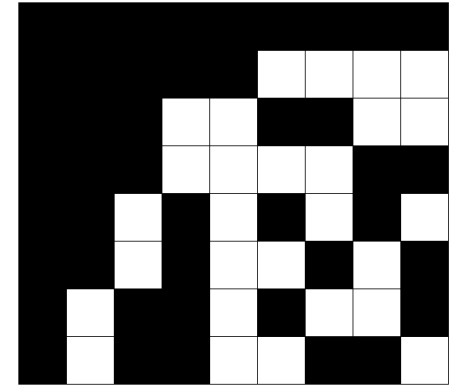
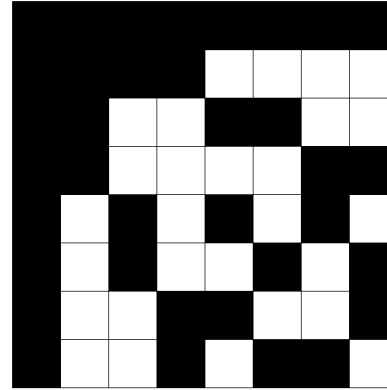
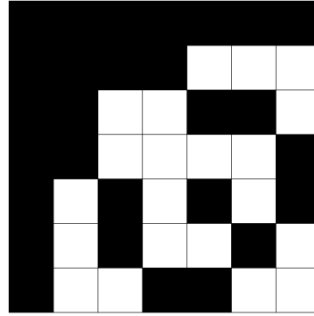
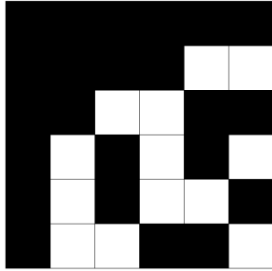
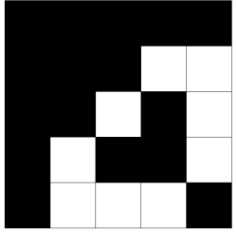
- Note that the pseudo-hadamard matrix is a hadamard matrix when $n \equiv 0 \pmod{4}$.
- It is a generalized concept of hadamard matrices to the orders $n \not\equiv 0 \pmod{4}$.
- The result of computer search for some small values of n is shown here. Observe that there **does not** exist a pseudo-hadamard matrix of order **9**.

Order	Number of inequivalent PHCs
3	1
4	1
5	1
6	15
7	1
8	1
9	0
10	4718
11	1
12	1
13	1
14	> 1,000,000
15	5
16	5



Examples of PH Matrices

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Main Conjecture

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Conjecture 1: There exists a pseudo-Hadamard matrix of all positive orders n except for $n=9$.

- The truth of this conjecture for $n \equiv 0 \pmod{4}$ implies and is implied by the Hadamard Conjecture.

Number of Equivalence Classes

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- **Definition 5:** We denote by $N_E(m, n)$ the number of equivalence classes of binary matrices of the size $m \times n$.
- **Proposition 5:**
 - For a given size $m \times n$, the number of HR-minimals is the same as that of HC-minimals.
 - $N_E(m, n) = N_E(n, m)$ for any positive integers m and n .
- **Corollary 3 (of Corollary 2):** $N_E(m, n)$ is monotonically non-decreasing as m and n increases.

Some Formula

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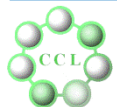
Theorem 3:

$$N_E(1, n) = 1$$

$$N_E(2, n) = \sum_{a=0}^{\lfloor \frac{n}{2} \rfloor} 1 = \left\lfloor \frac{n}{2} \right\rfloor + 1$$

$$N_E(3, n) = \sum_{a=0}^{\lfloor \frac{n}{2} \rfloor} \sum_{b=\lfloor \frac{a}{2} \rfloor}^{\lfloor \frac{n-a}{2} \rfloor} \sum_{c=\max(0, a-b)}^{\lfloor \frac{a}{2} \rfloor} 1$$






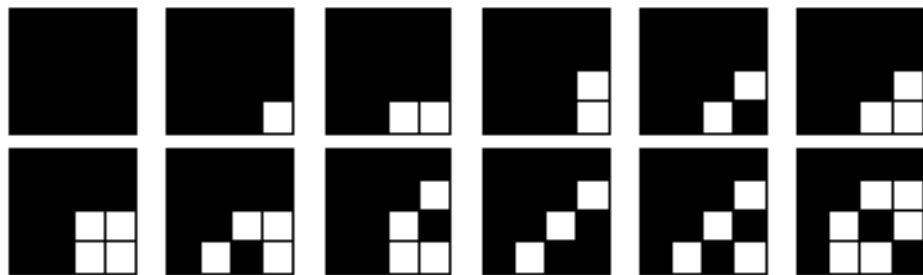
m \ n	1	2	3
1	1	1	1
2	1	2	2
3	1	2	3
4	1	3	5
5	1	3	6
6	1	4	9
7	1	4	11
8	1	5	15
9	1	5	18
10	1	6	23
11	1	6	27
12	1	7	34
13	1	7	39
14	1	8	47
15	1	8	54
16	1	9	64
17	1	9	72
18	1	10	84
19	1	10	94
20	1	11	108



Some Exhaustive Search

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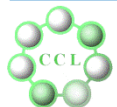
All the HR-minimals of small sizes

Size	Inequivalent Minimal Matrices	Number
2 x 2		2
2 x 3		2
2 x 4		3
3 x 3		3
3 x 4		5
4 x 4		12

Total Number of the Equivalence Classes

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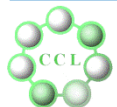
m \ n	1	2	3	4	5	6	7	8
1	1	1	1	1	1	1	1	1
2	1	2	2	3	3	4	4	5
3	1	2	3	5	6	9	11	15
4	1	3	5	12	18	35	54	94
5	1	3	6	18	39	101	228	551
6	1	4	9	35	101	388	1343	5083
7	1	4	11	54	228	1343	8102	53775
8	1	5	15	94	551	5083	53775	656108
9	1	5	18	140	1221	18366	355773	
10	1	6	23	224	2746	66524		
11	1	6	27	326	5850	231189		
12	1	7	34	495	12338	780372		
13	1	7	39	699	24994			
14	1	8	47	1012	49708			
15	1	8	54	1397	95771			
16	1	9	64	1955	180759			



Total Number of H-minimals

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m \ n	1	2	3	4	5	6	7	8
1	1	1	1	1	1	1	1	1
2	1	2	2	3	3	4	4	5
3	1	2	3	5	6	9	11	15
4	1	3	5	12	18	34	53	90
5	1	3	6	18	37	93	197	448
6	1	4	9	34	93	318	968	3109
7	1	4	11	53	197	968	4624	23518
8	1	5	15	90	448	3109	23518	200127
9	1	5	18	131	917	9549	118346	
10	1	6	23	205	1913	29244		
11	1	6	27	292	3728	85549		
12	1	7	34	434	7285			
13	1	7	39					
14	1	8	47					
15	1	8	54					
16	1	9	64					



Various ratios of H-minimals

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Size	Total No. of Eq. Classes (T)	No. of Classes containing H-minimal (H)	No. of Classes containing Symmetric H-minimal (S)	Ratio of H/T(%)	Ratio of S/T(%)	Ratio of S/H(%)
1x1	1	1	1	100	100	100
2x2	2	2	2	100	100	100
3x3	3	3	3	100	100	100
4x4	12	12	8	100	66.67	66.67
5x5	39	37	19	94.87	48.72	51.35
6x6	388	318	70	81.96	18.04	22.01
7x7	8102	4624	336	57.07	4.147	7.266
8x8	656108	200127	2675	30.50	0.4077	1.337

- Is the number going to increase monotonically?
 - Will it ever touch the value 0? - No, because of the all-zero matrix.
- Is the ratio going to decrease down to zero indefinitely?

Properties of H-minimals

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- **Proposition 6:** If A is an HR-minimal but **not** HC-minimal, then the matrix obtained by adjoining the all-zero-row at the top of A is (still an HR-minimal) but **not** an HC-minimal either.
- **Theorem 4:** Every equivalence class of size $m \times n$ contains H-minimal if and only if $m \leq 3, n \leq 3, 4 \times 4, 4 \times 5, \text{ or } 5 \times 4$.

Concluding Remarks

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- We propose:
 - A new problem on the classification of binary matrices in terms of the Hadamard equivalence.
 - Canonical forms that represent the equivalence classes.
 - Properties of HR-minimals and H-minimals.
 - Definition of Pseudo-Hadamard matrix
- We perform exhaustive search to determine the number of **equivalence classes** (and **H-minimals**, and also **pseudo-hadamard matrix classes**) of some small sizes.
- We leave some unsolved problems. One of them is related with the Hadamard conjecture:

For n which is a multiple of 4,
the set of all the HR-minimals of size $n \times n$
contains a Hadamard matrix.

