

Mixed Covering Arrays on Graphs

Presenter:

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Joint work with Karen Meagher and Lucia Moura
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Outline

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- q Applications
- q Covering Arrays on Graphs
- q Mixed Covering Arrays on Graphs
- q Graph Homomorphisms
- q Mixed Qualitative Independence Graph
- q n -chromatic Graphs for $n = 2, 3, 4, 5$
- q Graph Operations: Tree & Cycle Construction
- q Bipartite Graph Construction

Covering Array

A **Covering Array**, denoted $CA(N, k, g)$, is a $k \times N$ array with:

- entries from Z_g (g is the alphabet)
- and between any two rows any pair from Z_g occurs in some column.
(Pairs of rows satisfying this property are said to be **Qualitatively Independent**.)

$CAN(k, g)$ is the smallest N such that a $CA(N, k, g)$ exists.

Test light wiring in your home: 0 => OFF, 1 => ON

room \ test:	1	2	3	4	5
bedroom	0	1	1	1	0
hall	0	1	1	0	1
bathroom	0	1	0	1	1
kitchen	0	0	1	1	1

Example of an optimal CA: $CAN(4, 2) = 5$.

Applications

Covering Arrays are used in:

- q **Circuit Testing** (Boroday and Grunskii, 1992)
- q **Network Testing** (Williams and Probert, 1996)
- q **Software Testing** (Cohen, Dalal, Fredman and Patton, 1997; Cheng, Dumitrescu and Schroeder, 2003)

Software Testing Application

Software Testing:

- q Test parameters individually.
- q But faults generally result from the interaction between certain parameters.
- q Test every possible combination of parameter values. g^k GROWS EXPONENTIALLY!
- q Enormous test suite sizes even for a small number of parameters.
- q Covering arrays are used to test interaction between every pair of parameters.

Example: 10 parameters with 4 input values

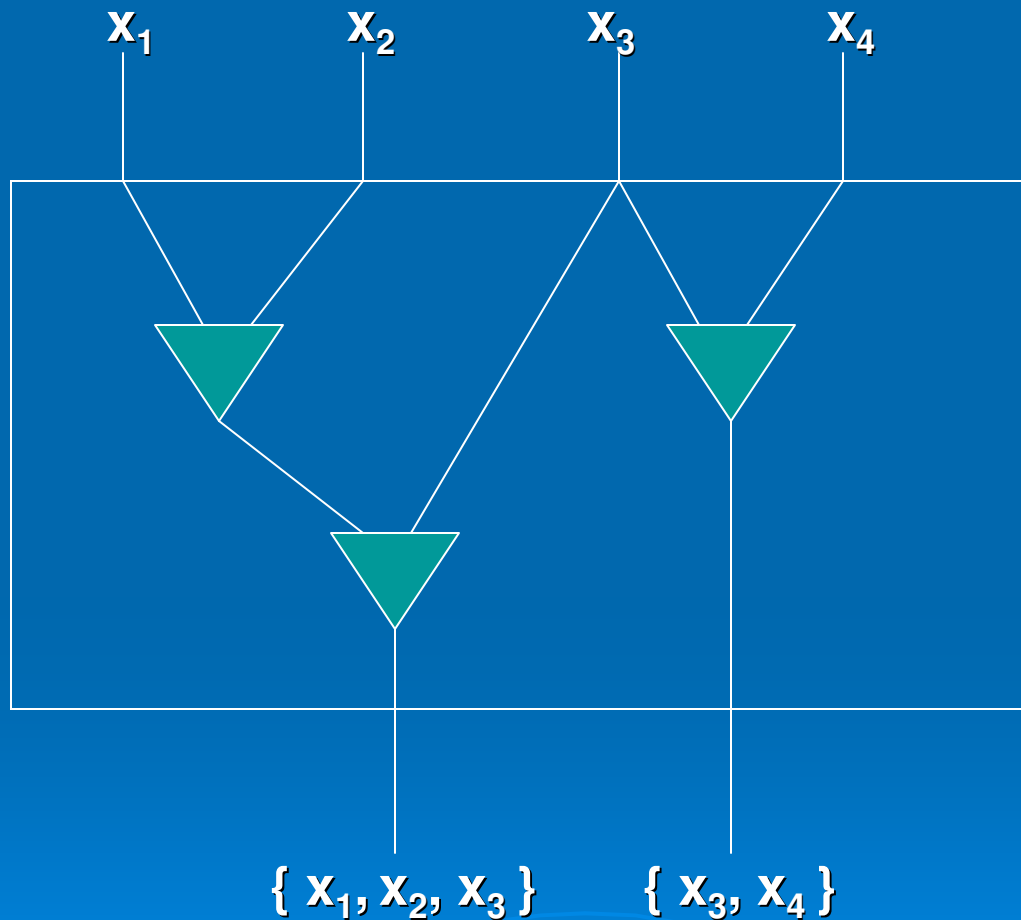
$k = 10, g = 4$, All possible interactions $\Rightarrow 4^{10} = 1,048,576$ test suites.

$k = 10, g = 4$, All pair-wise interactions $\Rightarrow 29$ test suites using a covering array.

Asymptotic result (Gargano, Korner and Vaccaro, 1990)

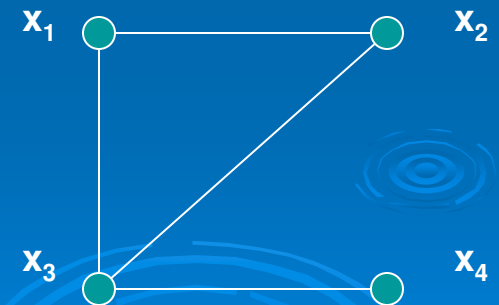
$$\lim_{k \rightarrow \infty} \text{CAN}(g, k) = \frac{g}{2} \log k$$

Circuit Testing Application



We do not need to test the interaction between $\{x_1, x_4\}$ or $\{x_2, x_4\}$.

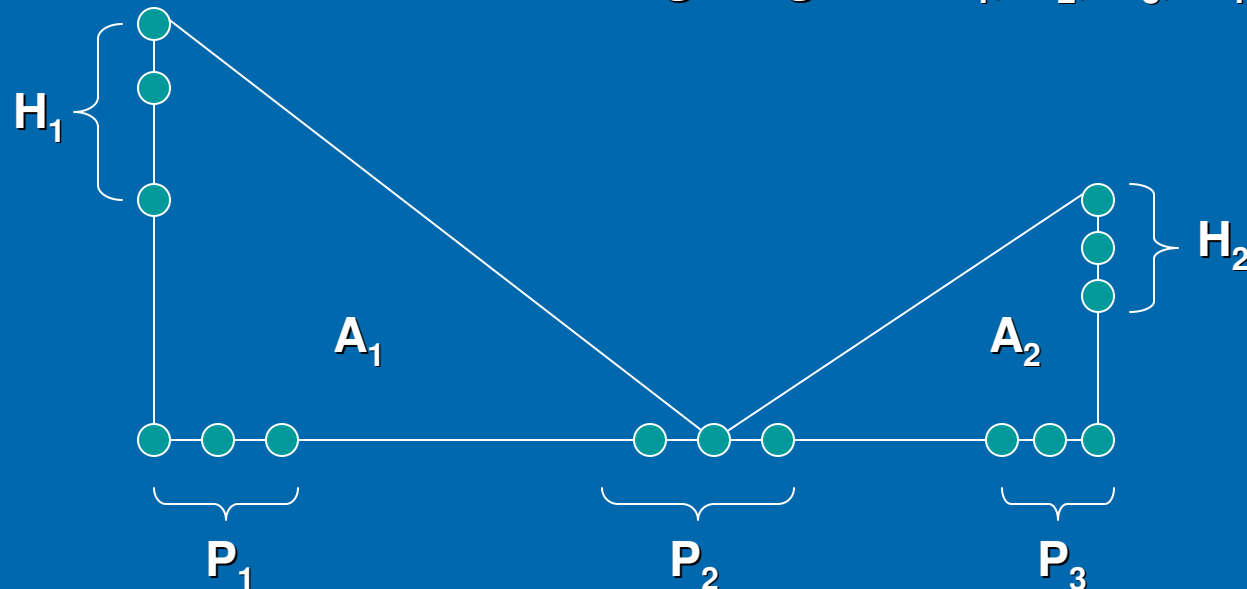
Build this graph:



Build a CA on the above graph.

Software Testing: Relevant Interactions

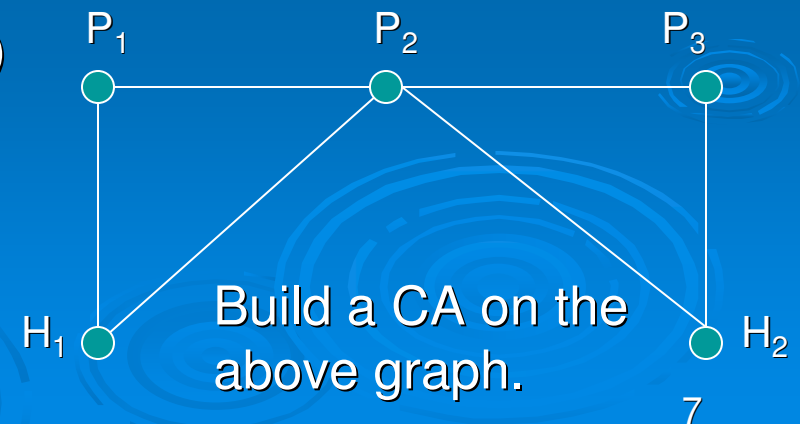
Find the area of two triangles given P_1, P_2, P_3, H_1, H_2 each with 3 values.



We do not need to test the interaction between $\{P_1, P_3\}$, $\{P_1, H_2\}$, $\{P_3, H_1\}$, or $\{H_1, H_2\}$.

Build this graph:

```
calculateTriangleArea(P1, P2, P3, H1, H2)
{
    A1 = 0.5 * (P2 - P1) * H1;
    A2 = 0.5 * (P3 - P2) * H2;
    return (A1, A2)
}
```

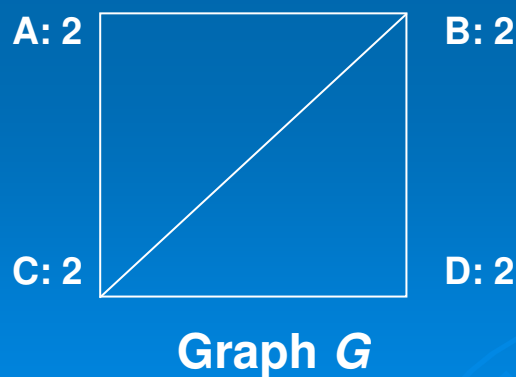


Covering Arrays on Graphs

A **Covering Array on a Weighted Graph G** , denoted **CA(N, G, g)**, is a

- $k \times N$ array where $k = |V(G)|$
 - with entries from Z_g (g is the alphabet and weight on vertices)
 - rows for adjacent vertices are qualitatively independent
- CAN(G, g)** is the smallest N such that a CA(N, G, g) exists.

Test wiring in your home:



room \ test:	1	2	3	4
A: bedroom	0	0	1	1
B: hall	0	1	0	1
C: bathroom	0	1	1	0
D: kitchen	0	0	1	1

Example of an optimal CA: CAN($G, 2$) = 4. 8

Covering Array

A **Covering Array**, denoted $CA(N, k, g)$, is a $k \times N$ array with:

- entries from Z_g (g is the alphabet)
- and between any two rows any pair from Z_g occurs in some column.
(Pairs of rows satisfying this property are said to be **Qualitatively Independent**.)

$CAN(k, g)$ is the smallest N such that a $CA(N, k, g)$ exists.

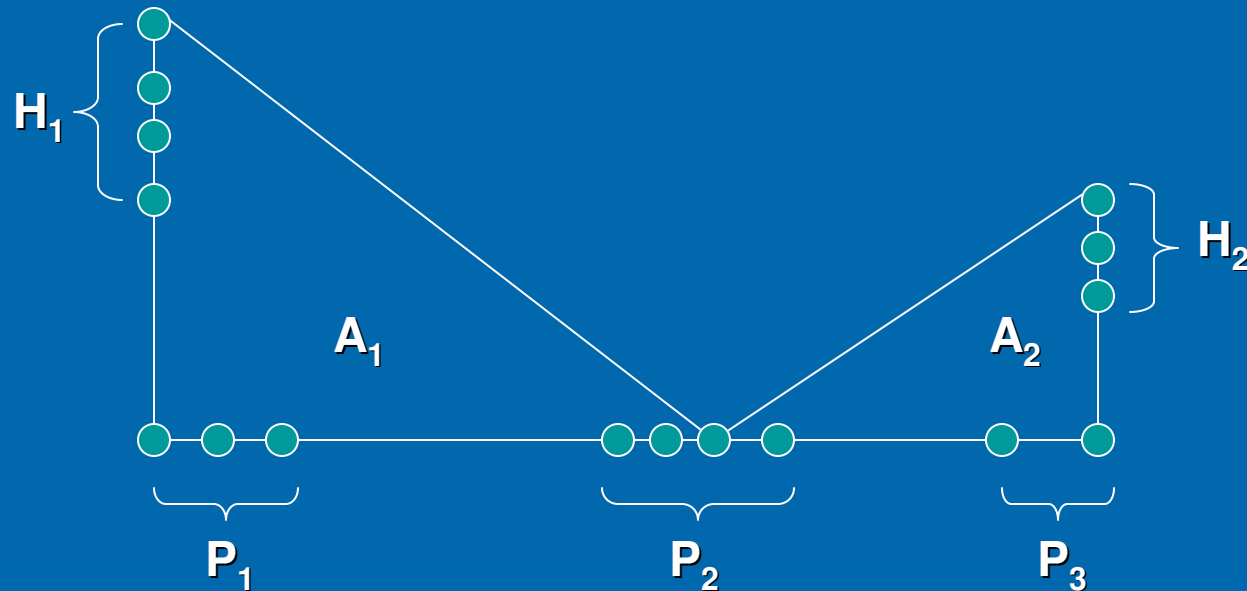
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room \ test:	1	2	3	4	5
bedroom	0	1	1	1	0
hall	0	1	1	0	1
bathroom	0	1	0	1	1
kitchen	0	0	1	1	1

Example of an optimal CA: $CAN(4, 2) = 5$.

Software Testing: Mixed Case

Find the area of two triangles given P_1, P_2, P_3, H_1, H_2 each with a different number of values.



We do not need to test the interaction between $\{P_1, P_3\}$, $\{P_1, H_2\}$, $\{P_3, H_1\}$, or $\{H_1, H_2\}$.

Build this graph:

```
calculateTriangleArea(P1, P2, P3, H1, H2)
```

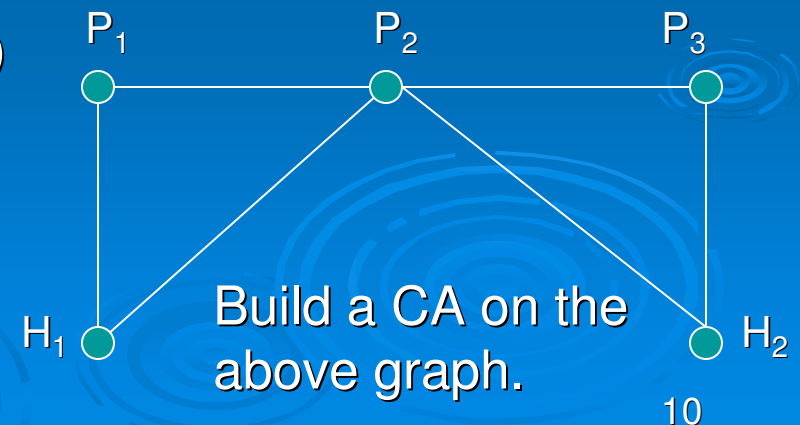
```
{
```

```
     $A1 = 0.5 * (P2 - P1) * H1;$ 
```

```
     $A2 = 0.5 * (P3 - P2) * H2;$ 
```

```
return (A1, A2)
```

```
}
```



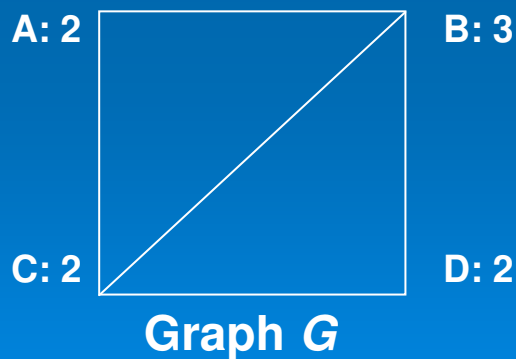
Mixed Covering Arrays on Graphs

A **Mixed Covering Array on a weighted Graph** G , denoted by $\text{CA}(\mathbf{N}, G, g_1 g_2 \dots g_k)$, has mixed alphabet sizes for different rows in the graph.

The **Product Weight** of a graph G , denoted $\text{PW}(G)$, is

$$\text{PW}(G) = \max \{w_G(u) * w_G(v) : \{u,v\} \in E(G)\}.$$

$$\text{CAN}(G, g_1, g_2, \dots, g_k) \geq \text{PW}(G)$$



room \ test:	1	2	3	4	5	6
A: bedroom	0	1	0	1	0	1
B: hall	0	0	1	1	2	2
C: bathroom	0	1	1	0	1	0
D: kitchen	0	1	1	0	0	1

Example of an optimal CA: $\text{CAN}(G, 2^3 3) = 6$.¹¹

Graph Homomorphisms

A mapping ϕ from $V(\mathbf{G})$ to $V(\mathbf{H})$ is a **graph homomorphism** from \mathbf{G} to \mathbf{H} if for all $v, w \in V(\mathbf{G})$, the vertices $\phi(v)$ and $\phi(w)$ are adjacent in \mathbf{H} whenever v and w are adjacent in \mathbf{G} .



Let \mathbf{G} and \mathbf{H} be weighted graphs. A mapping ϕ from $V(\mathbf{G})$ to $V(\mathbf{H})$ is a **weight-restricted graph homomorphism**, denoted $\mathbf{G} \xrightarrow{w} \mathbf{H}$, if ϕ is a graph homomorphism from \mathbf{G} to \mathbf{H} such that $w_{\mathbf{G}}(v) \leq w_{\mathbf{H}}(\phi(v))$, for all $v \in V(\mathbf{G})$.



Graph Homomorphisms

The following theorems are generalizations of work done by Meagher and Stevens (2002) for the uniform alphabet case.

Theorem 1: (Meagher, Moura, Zekaoui)

Let G and H be weighted graphs with weights g_1, g_2, \dots, g_k and h_1, h_2, \dots, h_l respectively. If there exists a weight-restricted graph homomorphism

$$\phi: G \xrightarrow{w} H \text{ then } \mathbf{CAN}(G, \prod_{i=1}^k g_i) \leq \mathbf{CAN}(H, \prod_{j=1}^l h_j).$$

Theorem 2: (Meagher, Moura, Zekaoui)

Let G be a weighted graph with k vertices and $g_1 \leq g_2 \leq \dots \leq g_k$ be positive weights. Then,

$$\mathbf{CAN}(K_{\omega(G)}, \prod_{i=1}^{\omega(G)} g_i) \leq \mathbf{CAN}(G, \prod_{j=1}^k g_j) \leq \mathbf{CAN}(K_{\chi(G)}, \prod_{l=k-\chi(G)+1}^k g_l).$$

n -chromatic Graphs for $n = 2, 3, 4, 5$

From Theorem 2 and results from the paper by Moura, Stardom, Stevens, and Williams (2003), we get the next theorem.

Theorem 3: (Meagher, Moura, Zekaoui)

Let G be a weighted graph with k vertices with

weights $g_1 \leq g_2 \leq \dots \leq g_k$. If one of the following holds:

1) $\chi(G) = 2, 3,$

2) $\chi(G) = 4$ and $\prod_{i=k-3}^k g_i \notin \{2^4, 6^4\}$, or

3) $\chi(G) = 5$ and $\prod_{i=k-4}^k g_i \notin \{2^5, 3^5, 23^4\}$ and $g_{k-1} \notin \{4, 6, 10\}$, then

$$\text{CAN}(G, \prod_{i=1}^k g_i) \leq g_{k-1} g_k.$$

The covering array number we are providing is an upper bound.

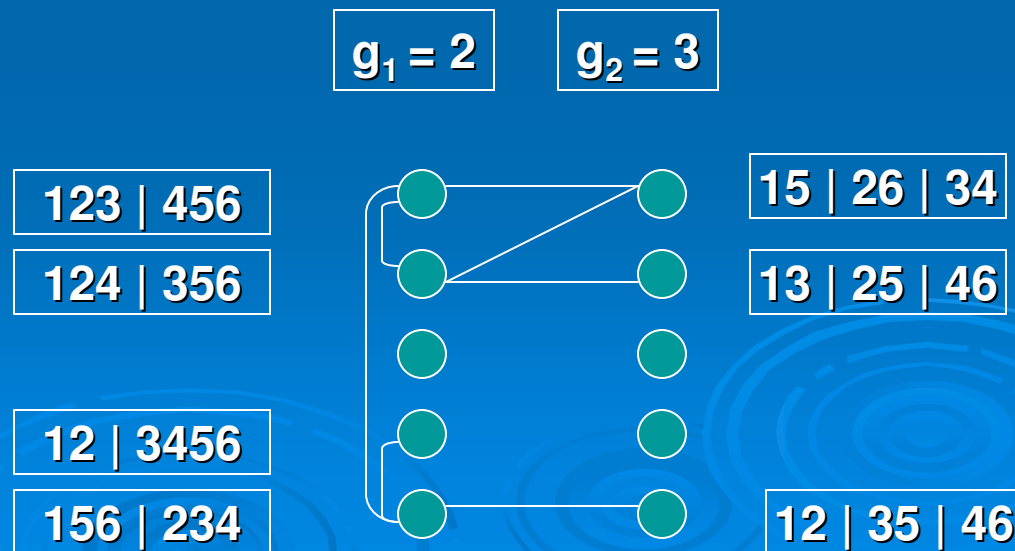
Mixed Qualitative Independence Graph

Mixed Qualitative Independence Graph, denoted

$QI(N, \prod_{i=1}^l g_i)$, is a graph:

- q whose vertex set is the set of all g_i -partitions of an N -set
- q vertices are adjacent if and only if their corresponding partitions are qualitatively independent.

Example: $QI(6, 2 \times 3)$



Mixed Qualitative Independence Graph

Theorem 4: (Meagher, Moura, Zekaoui)

For a weighted graph G and positive integers N and g_1, g_2, \dots, g_k there exists a $CA(N, G, \prod_{i=1}^k g_i)$ if and only if there exists a weight-restricted graph homomorphism $G \xrightarrow{w} \mathbf{QI}(N, \prod_{i=1}^k g_i)$.

Corollary 5: (Meagher, Moura, Zekaoui)

Let N be a positive integer and let G be a weighted graph with distinct weights g_1, g_2, \dots, g_r , repeated s_1, s_2, \dots, s_r times, respectively. If $\omega(G) > \omega(\mathbf{QI}(N, \prod_{i=1}^r g_i))$ or $X(G) > X(\mathbf{QI}(N, \prod_{i=1}^r g_i))$, then $\mathbf{CAN}(G, \prod_{i=1}^r g_i^{s_i}) > N$.

Mixed Covering Arrays on Graphs

The problem of finding an optimal covering array on a general graph has been shown to be NP-hard, even when restricted to the binary alphabet case. (Seroussi and Bshouty, 1988)

We will build optimal covering arrays for special classes of graphs:

- trees,
- cycles, and
- bipartite graphs.

From Theorem 3, for G in one of these classes we have

$$\text{CAN}(G, g_1, g_2, \dots, g_k) \leq g_{k-1} g_k.$$

Theorem 6: (Meagher, Moura, Zekaoui)

Let G be a weighted tree, cycle or bipartite graph then,

$$\text{CAN}(G, g_1, g_2, \dots, g_k) = \text{PW}(G).$$

Graph Operations

q One-vertex Edge Hooking

Insert a new edge where one end is in $V(G)$ and the other is a new vertex.

q Edge Duplication

Create an edge that is parallel to an existing edge in G .

q Weight-Restricted Edge Subdivision

Edge subdivision such that if x is the new vertex in G adjacent to vertices y and z then $w_G(x)w_G(y) \leq PW(G)$ and $w_G(x)w_G(z) \leq PW(G)$.

The above operations will have no effect on the covering array number of the modified graph.

Optimal Tree Construction

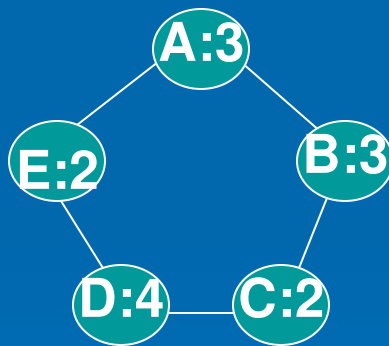
- q Build a tree T by starting with an edge $\{u, v\}$ such that $PW(T) = w(u) * w(v)$.
- q Next, apply successive one-vertex edge-hooking in the proper order so as to obtain T .
- q $CAN(T, g_1 g_2 \dots g_k) = PW(T)$

$$PW(T) = 15$$



Optimal Cycle Construction

To build a CA on the cycle C below with $PW(C) = 9$



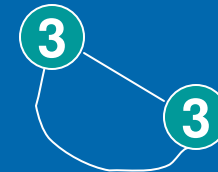
A:	000111222
B:	012012012
C:	000011110
D:	012301230
E:	010110101

$CA(9, C, 2^2 3^2 4)$

Step 1:



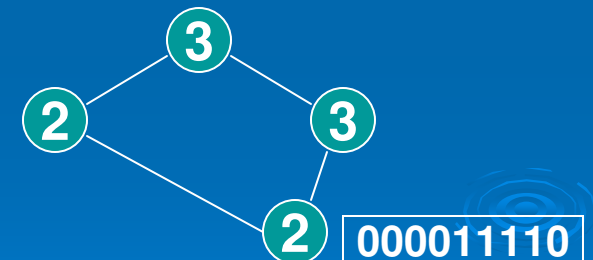
Step 2:



Step 3:



Step 4:



Step 5:



Optimal Bipartite Construction

Repeat each symbol $0, 1, \dots, g-1$ ($PW(\mathbf{G}) / g_i$) times

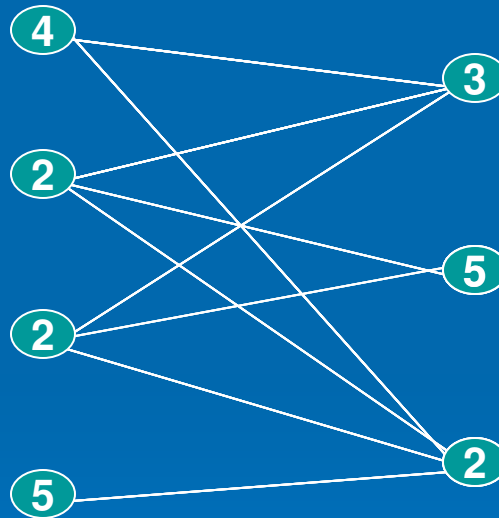
Repeat the symbols $0, 1, \dots, g-1$ ($PW(\mathbf{G}) / g_i$) times

000111222333

000000111111

000000111111

001122334401



012012012012

012340123401

010101010101

Graph \mathbf{G} : $PW(\mathbf{G}) = 12$

Future Work

Finding Optimal Covering Arrays for other classes of graphs

- q Solved for the uniform alphabet size cubic graphs and wheels

Implementing Tabu Search Methods for Covering Arrays

- q Stardom's Algorithm (2001).
- q Nurmela's Algorithm (2004).
- q Moura and Zekaoui's Algorithm (in progress)
which combines greedy techniques with a tabu search method that adds or deletes a test case at each iteration.

References

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Workshops, Ottawa, May 12-16

http://www.fields.utoronto.ca/programs/scientific/05-06/discrete_math/
http://www.fields.utoronto.ca/programs/scientific/05-06/covering_arrays/

Ø **Ottawa-Carleton DISCRETE MATH DAY**

Ø **May 12-13 (Friday-Saturday)**

Ø **Plenary Speakers:**

**Bill Cook, Anthony Evans, Jonathan
Jedwab, Pierre Leroux, Kieka
Mynhardt**

Ø **Workshop on COVERING ARRAYS**

Ø **May 14-16 (Sunday-Tuesday)**

Ø **Plenary Speakers:**

**Rick Brewster, Charlie Colbourn,
Peter Gibbons, Alan Hartman, Brett
Stevens, Doug Stinson.**

DEADLINE April 26

Ø **Student financial support
to travel to Ottawa**

Ø **Submission of abstracts
for **contributed talks****



THANK YOU