## Costas array search technique that maximizes backtrack and symmetry exploitation

## Jon C Russo <br> Keith G Erickson James K Beard

$\rightarrow-0-50 \mathrm{OL}$
$=-0-5 \mathrm{FL}$
$\rightarrow 0-20 \mathrm{OL}$
$-0-20 \mathrm{FL}$
$*-60 \mathrm{~L}$
$-1-6 \mathrm{FL}$
$-6-260 \mathrm{~L}$
$-6-26 \mathrm{FL}$
$-10-22 \mathrm{OL}$
$\rightarrow 10-22 \mathrm{FL}$


## Abstract

- Costas search techniques
- Generators don't find all of them
- We present two innovations that improve speed
- Innovations presented here
- Essentially full exploitation of symmetry
- Multiple level look-ahead preclusion
- Advantages gained
- Well-known symmetry gains a factor of two
- New symmetry gains approach a factor of four
- Look-ahead gains approach a factor of two
- Overall, factor of four over older methods


## Topics Today

- Background
- Backtrack programming with preclusion
- The difference table
- Generating the preclusion table
- Symmetry and sets related by rotation and transposition
- Sets of eight Costas arrays, when asymmetrical
- Symmetry causes duplications; only four to a set
- Innovation: full symmetry exploitation
- Innovation: multi-level look-ahead preclusion
- Results
- Overall a factor of four improvement
- The Last Costas Array?
- Costas arrays of large orders


## The Difference Table

- Example: $\{4,2,5,1,3\}$
- Row $n r$ is difference between columns $n c+n r$ and $n c$, given as $D<n r>(n c)=C A(n c+n r)-C A(n c)$

| Col | $\mathbf{1}$ | $\mathbf{2}$ | $\mathbf{3}$ | $\mathbf{4}$ | $\mathbf{5}$ |
| :--- | ---: | ---: | ---: | ---: | ---: |
| CA | 4 | 2 | 5 | 1 | 3 |
| D1 | -2 | 3 | -4 | 2 |  |
| D2 | 1 | -1 | -2 |  |  |
| D3 | -3 | 1 |  |  |  |
| D4 | -1 |  |  |  |  |

## The Preclusion Table

- Getting Started: Given two column indices

| Col | $\mathbf{1}$ | $\mathbf{2}$ | $\mathbf{3}$ | $\mathbf{4}$ | $\mathbf{5}$ |
| :--- | ---: | ---: | ---: | ---: | ---: |
| CA | 4 | 2 | 5 | 1 | 3 |
| D1 | -2 | 3 | -4 | 2 |  |
| D2 | 1 | -1 | -2 |  |  |
| D3 | -3 | 1 |  |  |  |
| D4 | -1 |  |  |  |  |

- Use the one available difference to preclude values of the third column index that would result in a duplication


## How the Preclusion Table Works

- Begin with the difference matrix

| Col | $\mathbf{1}$ | $\mathbf{2}$ | $\mathbf{3}$ | $\mathbf{4}$ | $\mathbf{5}$ |
| :--- | ---: | ---: | ---: | ---: | ---: |
| CA | 4 | 2 | 5 | 1 | 3 |
| D1 | -2 | 3 | -4 | 2 |  |
| D2 | 1 | -1 | -2 |  |  |
| D3 | -3 | 1 |  |  |  |
| D4 | -1 |  |  |  |  |

- Note that D1(2) is

$$
D 1(2)=C A(3)-C A(2) \neq D 1(1)
$$

- So, we have

$$
C A(3) \neq D 1(1)+C A(2)
$$

## The First Preclusion Table

- Table of precluded values of third column index

| Col | $\mathbf{1}$ | $\mathbf{2}$ | $\mathbf{3}$ | $\mathbf{4}$ | $\mathbf{5}$ |
| :--- | ---: | ---: | ---: | ---: | ---: |
| CA | 4 | 2 | 5 | 1 | 3 |
| D1 | -2 | 3 | -4 | 2 |  |
| D2 | 1 | -1 | -2 |  |  |
| D3 | -3 | 1 |  |  |  |
| D4 | -1 |  |  |  |  |


| Row Index | Reason |
| ---: | :--- |
| 0 | D1(1)+CA(2) |
| 1 |  |
| 2 | Taken |
| 3 |  |
| 4 | Taken |
| 5 |  |

## The Second Preclusion Table

- Table of precluded values of fourth column index

|  |  |  |  |  |  | Row Index | Reason |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Col | 1 | 2 | 3 | 4 | 5 | 2 | Taken |
| CA | 4 | 2 | 5 | 1 | 3 | 3 | D1(1)+CA(3), D2(1)+CA(2) |
| D1 | -2 | 3 | -4 | 2 |  | 4 | Taken |
| D2 | 1 | -1 | -2 |  |  | 5 | Taken |
| D3 | -3 | 1 |  |  |  | 6 |  |
| D4 | -1 |  |  |  |  | 7 |  |
|  |  |  |  |  |  | 8 | D1(2)+CA(3) |

## The Third Preclusion Table

- Table of precluded values of the fifth column index

| Col | $\mathbf{1}$ | $\mathbf{2}$ | $\mathbf{3}$ | $\mathbf{4}$ | $\mathbf{5}$ |
| :--- | ---: | ---: | ---: | ---: | ---: |
| CA | 4 | 2 | 5 | 1 | 3 |
| D1 | -2 | 3 | -4 | 2 |  |
| D2 | 1 | -1 | -2 |  |  |
| D3 | -3 | 1 |  |  |  |
| D4 | -1 |  |  |  |  |


| Row Index | Reason |
| ---: | :--- |
| -3 | D1(3)+CA(4) |
| -2 |  |
| -1 | D1(1)+CA(4), D3(1)+CA(2) |
| 0 |  |
| 1 | Taken |
| 2 | Taken |
| 3 |  |
| 4 | Taken, D1(2)+CA(4), D2(2)+CA(3) |
| 5 | Taken |
| 6 | D2(1)+CA(3) |

## Bitmasks for Rows of the Difference Matrix

- The difference table consists of numbers that may be anywhere from $-(\mathrm{N}-1)$ to ( $\mathrm{N}-1$ )
- The Costas condition is that no entry is ever allowed to repeat
- Bit 32 of a 64-bit register represents a difference of zero
- Bit positions in a 64-bit register can be used to represent a row of a difference matrix for searches up to order 33


## Bitmask for the Preclusion Table

- The preclusion table is shown for all values
- Only row indices from 0 to $\mathrm{N}-1$ are significant in the implementation
- A 32-bit mask is sufficient for searches up to order 32
- Initialize with the rows used up to that point in the search
- For each available row of the difference matrix
- Shift the difference mask by the row indices
- Update the preclusion mask with a logical OR


## Architecture-Independent Efficiency Measure

- Flow of the search method is
- Available values of the preclusion table are accepted as row indices
- A new preclusion table for the next row index is constructed
- Drop back to previous row index and table when all row indices have been used in current table
- The search method is conceptually recursive
- A count of the recursion levels entered is a measure of resources required to perform the search


## Symmetry

- \{4,2,5,1,3\}
- \{4,2,3,5,1\}



## Sets of Four or Eight

- Costas arrays formed from other Costas arrays by rotation and transposition are defined as being in a set
- We call Costas arrays of the same set are polymorphs of each other
- Symmetrical Costas arrays belong to sets of four
- Non-symmetrical Costas arrays belong to sets of eight


## Full Exploitation of Symmetry



- Search starts with dot in upper left-hand corner
- Finds all possible arrays with this initial dot fixed
- Can be accomplished by corner-dot extending arrays of order N-1
- Omission of this case offers some gains


## Exploitation of Symmetry (2)



- Search continues with dot in position $(1,2)$
- All corner dots may be eliminated from search
- All sets of Costas arrays with a corner dot have already been found


## Exploitation of Symmetry (3)



- Continue with dot in position $(3,1)$
- Corner dots and dots one away from corner are eliminated from search
- Implement by modifying initialization of the preclusion mask


## Exploitation of Symmetry (4)



- Continue with dot in position $(4,1)$
- All edge dots 0 through 2 away from a corner are eliminated
- In general, edge dots closer to any corner than the current fixed dot are eliminated
- They are guaranteed to have been covered by previous row-1 dot position searches


## Exploitation of Symmetry (5)



- Center dot not necessary
- There is no place for a[N-1]
- The range of a[0] from 1 to [(N-3)/2] is commonly used


## Using More Look-Ahead Levels in Preclusion

- A given recursion level terminates when its preclusion table is exhausted or filled
- The preclusion table is also computed for the next row index, which is checked for no available row indices
- The preclusion table can be computed for the row index after next, too
- We compute preclusion tables to the last available row


## Recursion Counts



## How Does Symmetry Exploitation Do the Job?

Recursion Counts
Versus
Row 1 Dot Position for Order 21

Abscissa: a[1] is corner dot

Overall factor of 0.45


## How Does Look-Ahead Do The Job?

Recursion Counts Versus Recursion Level

For Order 21

Overall factor of 0.60

## What Can We Expect for Higher Orders?



## What Gains Are Obtained?

Gains in Recursion Counts vs. Order

Note that odd and even orders are plotted separately


## Analyzing the Curves for Orders 14 through 21

- Least-squares fit, RMS errors 0.0005 or smaller
- Look-Ahead Gains
- For even order

$$
f_{L E}(N)=0.3074+\frac{3.437}{N}, \quad f_{L E}(28)=0.43
$$

- For odd order

$$
f_{L O}(N)=0.3161+\frac{2.8}{N}, \quad f_{L O}(28)=0.42
$$

- Symmetry exploitation gains
- For even order

$$
f_{S E}(N)=0.5253+\frac{2.147}{N}, f_{S E}(28)=0.60
$$

- For odd order

$$
f_{s o}(N)=0.5319+\frac{1.415}{N}, f_{s o}(28)=0.58
$$

- Omission of corner dot

$$
f_{C}(N)=0.98-\frac{3}{N}, \quad f_{C}(28)=0.872
$$

# Observed Look-Ahead Gains at Order 28 

| Case | Gain Ratio |
| :--- | :--- |
| $\{0,5,25,10,26 \ldots\}$ | 0.71 |
| $\{1,6,9,5,20 \ldots\}$ | 0.73 |
| $\{6,26,23,13,15 \ldots\}$ | 0.66 |
| $(10,22,26,8,2 \ldots\}$ | 0.31 |

## Overall Gain Ratio of About 0.43 is Reasonable

## Total Gains for Order 28

- From Look-Ahead
- Extrapolation from curves for orders $14-21$ estimates a factor of 0.43
- Corroborated by short sections for actual searches
- About 2:1 is a very conservative estimate
- From Symmetry exploitation
- Extrapolation from curves for orders 14 - 21 estimates a factor of 0.60
- Measured at 0.55 for orders 27 and 28
- Factor of 0.872 from omission of corner dot
- On top of 2:1 conventionally obtained by limiting search range of $a[0]$ from 0 to $[(\mathrm{N}-1) / 2]$
- TOTAL
- $0.60 \times 0.43 \times 0.872=0.225$, not including conventionally obtained $2: 1$
- Some gains from omitting corner dot


## A Look at Symmetry Filtering

- All Costas arrays, orders three through 400
- Contour plot, occurrence versus a[0]
- What full symmetry exploitation accomplishes
- Zoom in to look at orders 3 through 28
- A look at "spurious" Costas arrays


## All Costas Arrays



## Symmetry Filtered Costas Arrays



## All Costas Arrays



## Symmetry Filtered Costas Arrays



## Spurious Costas Arrays



## Symmetry Filtered Spurious Costas Arrays



## Costas Arrays Found by Search



## Costas Arrays Found by Search



## Costas Arrays Found by Search, Symmetry Filtered

## Number <br> Found vS. a[0]



## Costas Arrays Found by Search, Symmetry Filtered

## Number <br> Found VS. a[0]



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## The Last Costas Array

- Found by two teams in Spring of 2008
- Drakakis, et al., in a log dated March 9 (Euro supercomputer)
- Beard, et al., found April 8, announced May 29 (personal resources and resources of opportunity)
- Keith G Erickson
- Identified and accessed resources of opportunity
- Revised allocations to deal with unique restrictions on the use of this resource
- Executed allocated searches and found the Costas Array


## The Last Costas Array

- Costas array of order 27
- Few others of order over 26 have ever been found
- Likelihood that any others exist is slight

| 11 | 10 | 4 | 24 | 7 | 23 | 3 | 18 | 21 | 9 | 26 | 16 | 5 | 1 | 15 | 27 | 2 | 25 | 17 | 22 | 19 | 6 | 8 | 12 | 20 | 13 | 14 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 12 | 17 | 10 | 24 | 22 | 8 | 19 | 3 | 7 | 20 | 9 | 16 | 13 | 1 | 2 | 4 | 27 | 26 | 18 | 5 | 23 | 6 | 15 | 25 | 21 | 11 | 14 |
| 14 | 11 | 21 | 25 | 15 | 6 | 23 | 5 | 18 | 26 | 27 | 4 | 2 | 1 | 13 | 16 | 9 | 20 | 7 | 3 | 19 | 8 | 22 | 24 | 10 | 17 | 12 |
| 14 | 13 | 20 | 12 | 8 | 6 | 19 | 22 | 17 | 25 | 2 | 27 | 15 | 1 | 5 | 16 | 26 | 9 | 21 | 18 | 3 | 23 | 7 | 24 | 4 | 10 | 11 |
| 14 | 15 | 8 | 16 | 20 | 22 | 9 | 6 | 11 | 3 | 26 | 1 | 13 | 27 | 23 | 12 | 2 | 19 | 7 | 10 | 25 | 5 | 21 | 4 | 24 | 18 | 17 |
| 14 | 17 | 7 | 3 | 13 | 22 | 5 | 23 | 10 | 2 | 1 | 24 | 26 | 27 | 15 | 12 | 19 | 8 | 21 | 25 | 9 | 20 | 6 | 4 | 18 | 11 | 16 |
| 16 | 11 | 18 | 4 | 6 | 20 | 9 | 25 | 21 | 8 | 19 | 12 | 15 | 27 | 26 | 24 | 1 | 2 | 10 | 23 | 5 | 22 | 13 | 3 | 7 | 17 | 14 |
| 17 | 18 | 24 | 4 | 21 | 5 | 25 | 10 | 7 | 19 | 2 | 12 | 23 | 27 | 13 | 1 | 26 | 3 | 11 | 6 | 9 | 22 | 20 | 16 | 8 | 15 | 14 |

## How Was It Found?

- Multiple independent searches over allocated task space produces mountains of data
- Central bookkeeping methodology
- Read all the data, every time
- Produce counts, breakdowns as output
- Begin with output of extended generator program
- A change in the count indicates that a new Costas array has been found
- Comparison of outputs with output from generator program reveals which ones are new
- High-powered CS engines for sort and other tasks allows processing "mountains of data" for data summaries as often as desired


## Other Methods

- Augmentation
- Construct augmented matrix from two Costas arrays
- Result must satisfy Costas condition
- Interaction between matrices will almost always result in a violation of the Costas condition
- Interleaving
- Two Costas arrays with orders differing by at most one
- Construct checkerboard interleaved matrix


## A Remarkable Example



## Cumulative Totals versus Order



## Summary

- Search algorithm developed by this team
- Computational resources were unremarkable
- Desktop computers owned and maintained by team
- Occasional off-hours use of desktops by consenting organizations
- Other temporary resources of opportunity as identified and exploited by team members
- Published first completed searches over orders 24, 25, 26
- Found and first reported last Costas array of order 27


## Conjectures (1 of 2)

- No Costas arrays above order six exist that have two empty quadrants.
- Orders 32 and 33 will be searched within the next 15 years. No Costas arrays of those orders will be found.
- The current generalizations and generators find all that exist above order 27.
- The number of Costas arrays of any given order $N>23$ does not exceed $N^{2}$. [FALSE]
- Cumulative count fits $0.19 \cdot N^{2.78}$ for large $N$


## Conjectures (2 of 2)

- The number of consecutive orders $K$ for which no Costas arrays exist has no upper bound. But, for any order $L$, an order $N$ exists for which there are Costas arrays, and max\{|L/N-1|\} has no lower bound as $L$ increases.
- The value of Costas arrays in spectrum sharing will make them ubiquitous in communications and radar waveforms.
- The 2-D correlation properties of Costas arrays will make them fundamental to digital fingerprinting.


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- Wright and Monteleone participated through orders 26
- LMCO ATL Publications proofread and reviewed this work
- Keith G Erickson's contributions include the discovery of "the last Costas array"
- Identified unique resources of opportunity
- Defined revision of allocation to condition data to meet restrictions of this resource
- Exploited this resource and produced results to Team Bookkeeping central processing


## References (1 of 2)

[^0]
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