

# High Performance Computing from a General Formalism: Conformal Computing Techniques Illustrated with a Quantum Computing Example

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# Overview

- **Conformal Computing**: streamlining computation and shedding light on physics
- Breakthroughs obtained by restructuring (*reshaping*) multidimensional arrays to suit the **problem** and **processor/memory/FPGA hierarchy**
- Significant advances: FFT factors of 2 to 4 speedup
- **Bit Reversal** = *multi-dimensional transpose*
  - » Fortran 95 definition is MoA definition
- **Fundamental view: The Hypercube**
- **This talk: Conformal Computing and Density Matrices**

# Virtual Arrays

Connecting the *Algorithm-Software-Hardware* Boundary  
(*ideally the Physics-Algorithm-Software-Hardware*)

- **Array restructuring: *reshape-transpose***
  - An algebra of arrays and index calculus
    - MoA and Psi calculus:
      - *Conformal Computing*
    - *Mullin-Raynolds Conjecture:*
      - Second Fundamental Theorem of the Psi Calculus: *Reshape-Transpose*
      - First, is the *Psi Correspondence Theorem (PCT)*
        - Mullin and Jenkins, *Concurrency: Practice and Experience 9-96*

# Data Structure *insights*

- The *structure* of density matrices
  - What is the *structure* really?
  - Is the *matrix* the *ideal way* of seeing a quantum algorithm?
    - Are there other representations more ideal?
    - Must we always use **Permutation Matrices** to permute indices?
    - Can we **envision** a **quantum algorithm**?
      - **Hypercubes**:  $L^2$  space

# Reshape-Transpose

- **Array restructuring: *reshape-transpose***
  - Restructure the density matrix
  - Restructure to **lift dimension** to match processor/memory/FPGA hierarchy.
  - View **qubits** as **coordinates** in a hyperspace
    - ***Reshape-transpose*** and ***hypercube*** common themes in FFT:
      - ***bit reversal*** is ***hypercube transpose***
      - ***transpose vector*** to define ***butterfly in FFT***
      - ***transpose vector*** to define ***cache loop in FFT***
        - » Computer Physics Communications
        - » Materials Research Society
        - » Digital Signal Processing
  - ***NO Permutation Matrices and NO Matrix Multiplication to permute indices***

## Example: *Block Decomposition*

$$A = \left[ \begin{array}{cc|cc} 0 & 1 & 2 & 3 \\ 4 & 5 & 6 & 7 \\ \hline 8 & 9 & 10 & 11 \\ 12 & 13 & 14 & 15 \end{array} \right]$$

*2-dimensional*

*Viewed as  
4-dimensional*

$$A'' = \langle 0 \ 2 \ 1 \ 3 \rangle \phi A' = \left[ \left[ \begin{array}{c} \left[ \begin{array}{cc} 0 & 1 \end{array} \end{array} \right] \left[ \begin{array}{cc} 8 & 9 \end{array} \right] \right. \\ \left. \left[ \begin{array}{c} \left[ \begin{array}{cc} 4 & 5 \end{array} \end{array} \right] \left[ \begin{array}{cc} 12 & 13 \end{array} \right] \right. \\ \left. \left[ \begin{array}{c} \left[ \begin{array}{cc} 2 & 3 \end{array} \end{array} \right] \left[ \begin{array}{cc} 10 & 11 \end{array} \right] \right. \\ \left. \left[ \begin{array}{c} \left[ \begin{array}{cc} 6 & 7 \end{array} \end{array} \right] \left[ \begin{array}{cc} 14 & 15 \end{array} \right] \right. \end{array} \right]$$

# Array “shapes”

- **Shape operator:**  $\rho$  returns a vector containing the lengths of each dimension
- **Total number** of components in **A** is **16**.

$$\rho A = \langle 4 \ 4 \rangle$$

- **Shape of A** (**two-dimensional**):

- **Shape of A'** (**four-dimensional**):

$$\rho A' = \langle 2 \ 2 \ 2 \ 2 \rangle$$

- **Shapes** are **factors** of the total number of components.
- **Factors** fit the physics and **factors** fit the levels of processor/memory/FPGA/...

# *“Reshape”* Operator

$$A = \begin{bmatrix} 0 & 1 & 2 & 3 \\ 4 & 5 & 6 & 7 \\ 8 & 9 & 10 & 11 \\ 12 & 13 & 14 & 15 \end{bmatrix}$$

*2-dimensional*

The process of *“lifting”* the dimension is carried out with the *“reshape”* operator

$$A' = \langle 2 \ 2 \ 2 \ 2 \rangle \hat{\rho} A$$

Becomes  
*4-dimensional*

$$A' = \left[ \begin{array}{c} \left[ \begin{array}{c} \left[ \begin{array}{cc} 0 & 1 \end{array} \right] \\ \left[ \begin{array}{cc} 2 & 3 \end{array} \right] \\ \left[ \begin{array}{cc} 4 & 5 \end{array} \right] \\ \left[ \begin{array}{cc} 6 & 7 \end{array} \right] \end{array} \right] \left[ \begin{array}{c} \left[ \begin{array}{cc} 8 & 9 \end{array} \right] \\ \left[ \begin{array}{cc} 10 & 11 \end{array} \right] \\ \left[ \begin{array}{cc} 12 & 13 \end{array} \right] \\ \left[ \begin{array}{cc} 14 & 15 \end{array} \right] \end{array} \right] \end{array} \right]$$



# “Transpose” operator

- **Transpose** operator  $\phi$  permutes the dimensions

$$A' = \left[ \begin{array}{c} \left[ \begin{array}{cc} 0 & 1 \end{array} \right] \\ \left[ \begin{array}{cc} 2 & 3 \end{array} \right] \\ \left[ \begin{array}{cc} 4 & 5 \end{array} \right] \\ \left[ \begin{array}{cc} 6 & 7 \end{array} \right] \end{array} \right] \left[ \begin{array}{c} \left[ \begin{array}{cc} 8 & 9 \end{array} \right] \\ \left[ \begin{array}{cc} 10 & 11 \end{array} \right] \\ \left[ \begin{array}{cc} 12 & 13 \end{array} \right] \\ \left[ \begin{array}{cc} 14 & 15 \end{array} \right] \end{array} \right]$$

*transpose vector*



$$A'' = \langle 0 \ 2 \ 1 \ 3 \rangle \phi A' = \left[ \begin{array}{c} \left[ \begin{array}{cc} 0 & 1 \end{array} \right] \\ \left[ \begin{array}{cc} 4 & 5 \end{array} \right] \\ \left[ \begin{array}{cc} 2 & 3 \end{array} \right] \\ \left[ \begin{array}{cc} 6 & 7 \end{array} \right] \end{array} \right] \left[ \begin{array}{c} \left[ \begin{array}{cc} 8 & 9 \end{array} \right] \\ \left[ \begin{array}{cc} 12 & 13 \end{array} \right] \\ \left[ \begin{array}{cc} 10 & 11 \end{array} \right] \\ \left[ \begin{array}{cc} 14 & 15 \end{array} \right] \end{array} \right]$$

# “Hypercube” Representation

- The arrays  $A'$  and  $A''$  are examples of “*hypercubes*”
  - » multi-dimensional *unit-cubes*
- Often array operations simplify in the hypercube representation, *e.g. bit reversal, permutations*
- In a hypercube: all dimensions have *length 2*
- A hypercube allows the input vector to be viewed in the *highest dimension possible*.
- Across dimensions every component can be related to every other component, i.e. permutations are easily made.



# The punch line

- Through **direct indexing**, arbitrary data re-arrangements can be performed in **ONE STEP**
- This leads to exceedingly efficient computation
- **Fundamental perspective:** by viewing the data in computation in the most general way is leading to **new insights into the underlying physics**
- **Notice ALSO:** all the squares on the diagonal can be accessed in **parallel**, i.e. over the **primary axis index** or **processor index**(or cache index or whatever we are using).

# Computation and Gates

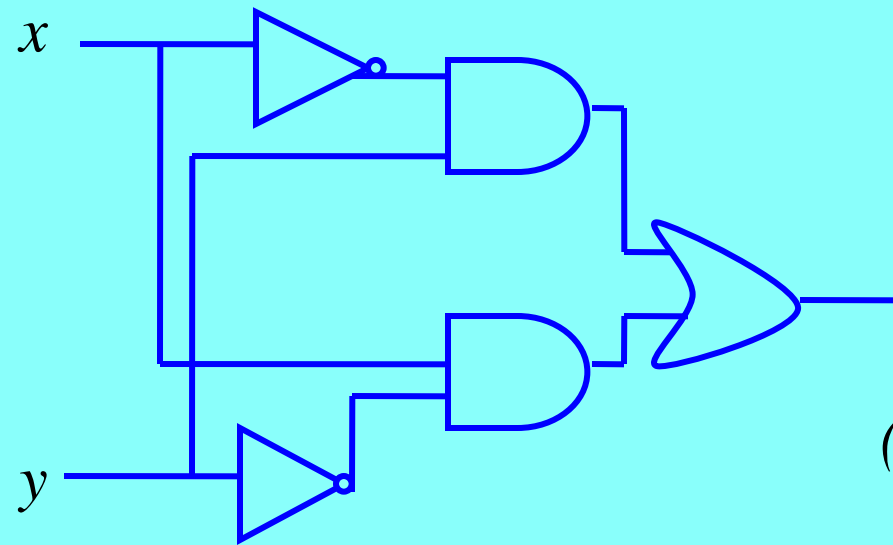
- From **Classical** to **Quantum** Gates
  - **Classical** XOR
    - Diagram
    - Boolean Algebra
    - Logic Expression: Boolean Table
  - **Reversible** XOR: Controlled NOT
    - Diagram
    - Boolean Table
  - **Quantum** NOT: **Reversible**
    - Linear Algebra

# From *Classical* to *Quantum* Computing

- Basic Gates in **Classical** Computers
  - and, or, not
- Basic Gates in **Quantum** Computers
  - not, controlled not, controlled- controlled not

## *Major Differences*

- **ONE** state versus **ALL** states
- **Boolean Algebra** versus **Linear Algebra**
- **Irreversible** versus **Reversible** computation



## Classical *xor* 2 bits in 1 out

$x \ y \ xor(x,y)$

0 0 0

1 0 1

0 1 1

1 1 0

$$(\bar{x} \circ y) + (\bar{y} \circ x)$$

$$((x=0) \& (y=1)) / ((y=0) \& (x=1))$$

## Reversible *xor* 2 bits in 2 out

*Controlled NOT (classical implementation)*

$cnot(x,y)$

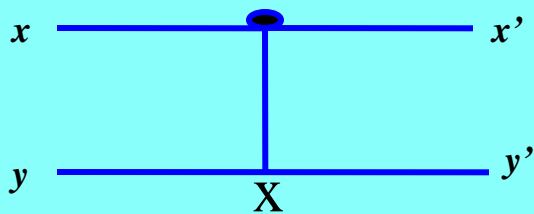
$x \ y \ x' \ y'$

0 0 0 0

1 0 1 1

0 1 0 1

1 1 1 0



# Some Notation

$$\begin{bmatrix} 1 \\ 0 \end{bmatrix} = |0\rangle \quad \text{or} \quad \begin{bmatrix} 0 \\ 1 \end{bmatrix} = |1\rangle$$

- Use **matrices** to denote states
  - The above are **basis states** in an abstract space (Hilbert space).
- **Linear Algebra** to relate gate operations
- **Classical states** use **Boolean Algebra**



# Basis states: what are they, really?

- Physical example: the states  $|0\rangle$  and  $|1\rangle$  can be realized as the **spin-down** and **spin-up** states of a spin-1/2 particle such as an electron.
- States (information) are manipulated through the application of electro-magnetic fields.
- Example: application of an EM pulse can flip a state from down to up (**just like in Nuclear Magnetic Resonance spectroscopy**).

$$|\Psi(t)\rangle = \alpha(t)|0\rangle + \beta(t)|1\rangle$$

$$\alpha(0) = 1; \beta(0) = 0 \Rightarrow \alpha(\tau) = 0; \beta(\tau) = 1$$

## Some Notation (cont.)

- **General state: superposition (linear combination)**

$$\alpha|0\rangle + \beta|1\rangle = \alpha \begin{bmatrix} 1 \\ 0 \end{bmatrix} + \beta \begin{bmatrix} 0 \\ 1 \end{bmatrix} = \begin{bmatrix} \alpha \\ 0 \end{bmatrix} + \begin{bmatrix} 0 \\ \beta \end{bmatrix} = \begin{bmatrix} \alpha \\ \beta \end{bmatrix}$$

$$\begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix} \times \begin{bmatrix} \alpha \\ \beta \end{bmatrix} = \begin{bmatrix} \alpha \\ \beta \end{bmatrix}$$

$$\begin{bmatrix} 0 & 1 \\ 1 & 0 \end{bmatrix} \times \begin{bmatrix} \alpha \\ \beta \end{bmatrix} = \begin{bmatrix} \beta \\ \alpha \end{bmatrix}$$

# Higher Dimensions

- **Basis states in higher dimensions from Cartesian products of  $|0\rangle$  and  $|1\rangle$**
- **For example**
  - $|00\rangle = |0\rangle|0\rangle$
  - $|01\rangle = |0\rangle|1\rangle$
  - $|10\rangle = |1\rangle|0\rangle$
  - $|11\rangle = |1\rangle|1\rangle$
- **A general state is a linear combination of these basis states in this 4-dimensional space:**

# Example: **CNOT**(*controlled not*)

$$\Psi = (\alpha|0\rangle + \beta|1\rangle)|0\rangle = \alpha|00\rangle + \beta|10\rangle =$$

$$\Psi = \begin{pmatrix} \alpha|00\rangle \\ 0|01\rangle \\ \beta|10\rangle \\ 0|11\rangle \end{pmatrix} = \begin{pmatrix} \alpha \\ 0 \\ \beta \\ 0 \end{pmatrix}$$

$$\text{CNOT} = \begin{pmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 0 & 1 \\ 0 & 0 & 1 & 0 \end{pmatrix}$$

$$\text{CNOT } \Psi = \begin{pmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 0 & 1 \\ 0 & 0 & 1 & 0 \end{pmatrix} \begin{pmatrix} \alpha \\ 0 \\ \beta \\ 0 \end{pmatrix} = \begin{pmatrix} \alpha \\ 0 \\ 0 \\ \beta \end{pmatrix} = \alpha|00\rangle + \beta|11\rangle$$

# Physical Observables

- **Measurable quantities**  $A(t)$  calculated as averages of operators:  $\hat{A}(t)$

- **Wave function vs. density matrix representation**

$$A(t) = \langle \psi(t) | \hat{A}(t) | \psi(t) \rangle = \text{Tr}[\hat{\rho}(t) \hat{A}(t)]$$

$$\text{Tr}[\hat{a}\hat{b}] = \sum_{lm} a_{lm} b_{ml}$$

# Quantum Simulation

- Quantum **simulators**: *we can't build many qubit quantum computers YET*
  - One method: **density matrix** method
    - Computations are **Gate** Operations
    - **Gate** Operations are **Matrix** Operations
    - Linear Algebra
    - Algebra of Arrays(MoA): Algorithm and Architecture

# Industrial applications

- **GE-Lockheed Martin Objectives**
  - Flexible extensible simulator for quantum algorithms
  - Provide high performance throughput
    - Advanced Architectures: **NEED** portable, scalable designs, optimal performance.
      - May include multiple processors, levels of memory, FPGAs.
        - **SGI MOATB**
        - **Cray XD1**
      - Exploit sparseness and structure of gate operators
      - Simulate systems with **more than 14 qubits**
      - In a **Quantum Computer** we require **in excess** of  $2^{31}$  bytes

# Simulations

## *Why simulate?*

Quantum computers are difficult to build

- Usually small laboratory experiments: 4-5 qubits

Major **error mechanisms can be modeled**

- Hardware imperfections and physical phenomena

**Simulation** allows observation of intermediate states

- Reversible conventional gates

Use the simulator to explore **quantum algorithm** development for **digital and image processing** applications, e.g. **FFT**





# Density Matrix $2^n \times 2^n$ to Quantum Density Hypercube

## **2-d to 2n-d**

- one qubit: 2 by 2 matrix
- two qubits: 4 by 4 matrix
- three qubits: 8 by 8 matrix
- ...

**Goal:** Create a **Quantum Algorithm** to perform  **$n$  qubit-gate** operations that is **true** to the **physics** AND **computational platform**. *Thus, all designs are verifiable, and scalable to existing AND emerging architectures.*

# Density Matrix $2^n \times 2^n$ to Quantum Density Hypercube

**2-d to 2n-d**

- View the **qubits** as **coordinates** in the Quantum Density Hypercube
- Create a **permutation vector** that will be used to perform a **multi-dimensional transpose** on the Quantum Density Hypercube.
- The **result** of this **transpose aligns matrices** on the **diagonal** of the original Density Matrix
- **Gate is then applied**, again noting the gates can be applied in parallel , i.e. the **processor index** is the **primary axis** index.

# Density Matrix $2^n \times 2^n$ to Quantum Density Hypercube

**2-d to 2n-d**

- The **design** and subsequent **implementation** uses the least amount of resources.
- **Normal forms** after MoA and Psi Analysis, yield a **generic design** independent of platform.

# Qubits, Indices, and Permutations

**Example:** 16 by 16 Density Matrix becomes a  $2^8$  Quantum Density Hypercube

*Note that the design is for  $2^n$  by  $2^n$ ,  $0 \leq n$ ,  $n$  in  $I^+$   
AND **any number of bits.***

***Recall the xls file previously shown***

# Qubits, Indices, and Permutations

## Assumptions in the Example:

- Let **a** and **b** denote which bits to gate:
  - **xxab**: bits 0 and 1                      **axxb**: bits 0 and 3    ...
- **bits** are numbered from **right** to left:
  - **1 1 1 0** is used to evaluate its decimal equivalent  
 $(1 * 2^3) + (1 * 2^2) + (1 * 2^1) + (0 * 2^0)$
- **indexing** is numbered from **left** to right
  - As a vector,  $\langle 1 1 1 0 \rangle$  when indexed would yield:  
 $\langle 1 1 1 0 \rangle[0] = 1$   
...  
 $\langle 1 1 1 0 \rangle[3] = 0$

# Qubits, Indices, and Permutations

Example(cont.): From qubits to permutation vector

- bits **0,2**: xaxb ->  $\begin{matrix} 3 & 2 & 1 & 0 \\ 0 & 1 & 2 & 3 \end{matrix}$  **bit ordering**  
 $\begin{matrix} 3 & 2 & 1 & 0 \\ 0 & 1 & 2 & 3 \end{matrix}$  **index ordering**  
 $\begin{matrix} 0 & 2 & 1 & 3 \\ 0 & 2 & 1 & 3 \end{matrix}$  bit 2 is index 3  
swap bits 1 and 2  
**<0 2 1 3 4 6 5 7>** is the transpose vector

- bits **1,2**: xabx ->  $\begin{matrix} 3 & 2 & 1 & 0 \\ 0 & 1 & 2 & 3 \end{matrix}$  **bit ordering**  
 $\begin{matrix} 3 & 2 & 1 & 0 \\ 0 & 1 & 2 & 3 \end{matrix}$  **index ordering**  
 $\begin{matrix} 0 & 1 & 3 & 2 \\ 0 & 1 & 3 & 2 \end{matrix}$  swap bits 2 and 3  
 $\begin{matrix} 0 & 3 & 1 & 2 \\ 0 & 3 & 1 & 2 \end{matrix}$  swap bits 1 and 2  
**<0 3 1 2 4 7 5 6>** is the transpose vector

- bits **0,3**: axxb -> **<2 1 0 3 6 5 4 7>**
- bits **1,3**: axbx -> **<3 1 0 2 7 5 4 6>**
- bits **2,3**: abxx -> **<2 3 0 1 6 7 4 5>**

# From Permutation Vector to the Diagonal

**Given:** a permutation vector denoted by  $\vec{t}$ , *the transpose vector*, permute all indices.

- **Apply binary transpose** after **reshaping**(restructuring) the **density matrix** into a **density hypercube**.
  - Permute all indices as defined by the **transpose vector**
- **Gated arrays** are now **on the diagonal**.



# From Permutation Vector to the Diagonal

- Indices are calculated and **addressed directly** from the **original array stored in memory**:
  - Algebraically the Physics
  - Algebraically all at once
  - Algebraically decomposable to **present** and **future** architectural platforms(**even quantum**)
  - Algebra remains the same throughout
    - the **problem**,
    - the **decomposition** over processor/memory/FPGA,
    - the **mapping**,
    - the **architectural abstraction**,
    - **verifiable** designs

# The General Expression

## Moa and Psi Reduction

Given  $\vec{s}$  DM s.t.  $\rho \text{DM} = \langle 2^n \ 2^n \rangle$ , restructure to a hypercube, **QDH**.  
 Let  $\vec{s}$  denote the shape of QDH s.t.  $\vec{s} = \langle 2n \ \rho^{\wedge} \ 2 \rangle$   
 $= \langle \underbrace{2 \dots 2}_2 \ 2 \rangle$   
**2n**

Then  $\vec{s} \text{QDH} = \rho^{\wedge} \text{DM}$

Use  $\vec{t}$ , the transpose vector previously defined.

Perform the binary transpose:

$$\vec{t} \text{ } \circ \text{ QDH}$$

Now, all matrices defined by bits chosen are on the diagonal.

**Note:** Restructuring back to DM and indexing creates no new arrays because of *Psi Reduction*.

# The General Expression

## Moa and Psi Reduction

$$\vec{t} \circ \text{QDH}$$

- This expression moves all gated coordinates to the diagonal (after reshaping) of DM.
- This expression describes the Physics in one operation.
- Now **Psi Reduce** to normal form -> Generic Design.

forall  $\vec{i}$  s.t.  $0 \leq i < 2^{2n}$

$$\vec{i} = \gamma'(\vec{i}; \mathbf{s})$$

$$\vec{i} = \mathbf{i}[\vec{t}] \rightarrow \rightarrow$$

$$\text{@DM} + \gamma(\mathbf{i}; \mathbf{s})$$

This is the **Generic Normal Form**

# Conclusions

- **MoA and Psi Calculus** *quantum algorithm* for **density matrix optimizations**.
  - Describes the **physics naturally**.
  - qubit access and gate application.
    - **Independent** of number of qubits.
    - **Independent** of density matrix size.
  - Describes **decomposition** and **mapping**.
    - Multiple processor/memory levels.
      - Normal form is a **generic design** independent of target architecture, ideally the physics directly.

# The punch line

- Through **direct indexing**, arbitrary data re-arrangements can be performed in **ONE STEP**
- This leads to exceedingly efficient computation
- **Fundamental perspective:** by viewing the data in computation in the most general way is leading to **new insights into the underlying physics**

# Future Directions

- Fundamental concepts: *reshape-transpose, hypercube representation...just beginning to be explored*
- Connections with quantum algorithms: Quantum FFT, Shor's factoring algorithm, etc
- **Highly efficient practical designs for today's (and tomorrow's) computers!**

# Acknowledgement

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**Thank you**