# Classical Coding Approaches to Quantum Applications

Narayanan Rengaswamy Rhodes Information Initiative at Duke (iiD), Duke University

Ph.D. Final Defense

March 18, 2020

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#### Narayanan Rengaswamy Rhodes Information Initiative at Duke (iiD), Duke University

Joint Work: Michael Newman, Kaushik Seshadreesan, Swanand Kadhe, Saikat Guha, Robert Calderbank and Henry Pfister

Ph.D. Final Defense

arXiv: 2003.04356, 1910.09333, 1904.07842, 1902.04022, 1907.00310

March 18, 2020

## Quantum Technologies Today







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Courtesy (clockwise from top-left): D-Wave, IBM, Google, IonQ

## Recent Exciting Result

#### Article

# Quantum supremacy using a programmable superconducting processor

ttps://doi.org/10.1038/s41586-019-1666-5	Frank Arute <sup>1</sup> , Kunal Arya <sup>1</sup> , Ryan Babbush <sup>1</sup> , Dave Bacon <sup>1</sup> , Joseph C. Bardin <sup>12</sup> , Rami Barends <sup>1</sup> , Rupak Biswas <sup>2</sup> , Sergio Boixo <sup>1</sup> , Fernando G. S. L. Brandao <sup>14</sup> , David A. Buell <sup>1</sup> , Brian Burkett <sup>1</sup> , Yu Chen <sup>2</sup> , <sup>1</sup> Jimu Chen <sup>2</sup> , Ben Chiaro <sup>5</sup> , Dobarto Colline <sup>3</sup> , William Courteou <sup>1</sup> Andrean Dunessorth <sup>1</sup> ,		
teceived: 22 July 2019			
Accepted: 20 September 2019	Edward Farhi <sup>1</sup> , Brooks Foxen <sup>15</sup> , Austin Fowler <sup>1</sup> , Craig Gidney <sup>1</sup> , Marissa Giustina <sup>1</sup> , Rob Graff <sup>1</sup> ,		
ublished online: 23 October 2019	Acetto subernit, Steve Francegger, Inatchew r. Harrigan', Michael J. Hartmann'', Altan Ho', Markus Hoffmann', Trent Huang', Travis S. Humble', Sergie V. Iakov', Van Jeffrey', Van J. Zhang Jiang', Dori Kafri, Kostyantyn Kochedzhi', Julian Kelly', Paul V. Klimov', Serger Knykl, Alexander Korotov'', Fedor Kostrisa, David Landhus', Mike Lindmark', Erik Lucero', Dmitry Lyakh', Salvatore Mandrà <sup>300</sup> , Jarrod R. McClean', Matthew McEven', Anthory Megnari, Xiao M, Kristel Michielsam <sup>300</sup> , Maroud Mohami, Josh Mutuz', Ofer Haaman', Matthew Noeley', Charles Nell', Murphy Yuzzhen Niu', Eric Ostby', Andre Potthow', John C. Patri, Chris Guintana', Elearor G. Rieffel', Pedram Roushan', Nicholas G. Rubin', Daniel Sank', Kovin J. Satzinger', Vadim Smelyanskiy', Kavin J. Sung <sup>130</sup> , Matthew D. Trevitick', Anti Yatanscherd', Benjamin Villanga <sup>300</sup> , Theodore White', Z. Jamie Yao', Ping Yeh', Adam Zalcman', Hartnut Neven' & John M. Martinis <sup>15</sup>		
	The promise of quantum computers is that certain computational tasks might be executed exponentially faster on a quantum processor than on a classical processor <sup>1</sup> . A fundamental challenge is to build a high-fidelity processor capable of running quantum algorithms in an exponentially large computational space. Here we report the use of a space space of the space of the space of dimension 2 <sup>st</sup> (about 10 <sup>o</sup> ). Measurements from repeated experiments sample the resulting probability distribution, which we verify using classical situations. Our Sysamore processor takes about 200 seconds to sample one instance of a quantum circuit a million times-our bandmarks.		

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anticipated computing paradigm.

supercomputer would take approximately 10,000 years. This dramatic increase in speed compared to all known classical algorithms is an experimental realization of quantum supremacy<sup>8-14</sup> for this specific computational task, heralding a much-

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Quantum technologies promise significant advances in several practical applications, but the hardware remains noisy

Question: What prominent applications and how to tackle noise? Here we consider two applications:

- Computing: Classical coding in dual bases; borrowed decoders
- Communications: Polar codes for classical-quantum channels

#### This Talk

Further strengthening the bridge to classical coding theory

- Computing: Classical coding in dual bases ⇒ quantum error correction is even possible; classical decoders can be borrowed
  - New classical coding problem under quantum fault-tolerance
  - Classical codes for quantum unitary 2-designs in benchmarking
- Communications: Classical polar codes for classical-input quantum-output channels; decoder infeasible in practice
  - Borrow belief-propagation algorithm with a quantum twist
  - Optimality, new application for photonic quantum computing

## Synthesizing Logical Operators for Stabilizer Codes

- Motivation and Strategy
- Logical Clifford Synthesis (LCS)
- Quadratic Form Diagonal (QFD) Gates
- Stabilizer Codes Matched to QFD Gates

## 2 Classical Communications over Pure-State Channels

- Introduction and Motivation
- Classical Belief-Propagation (BP)
- Belief-Propagation with Quantum Messages (BPQM)

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## Information $|x\rangle_L$

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#### QECC: Quantum Error Correcting Code



What QECC structure is required so that the physical application of certain gates preserves the code subspace?

What QECC structure is required so that the physical application of certain gates preserves the code subspace?

#### Key Idea

Pauli operators form an orthonormal basis for all operators!

- Understand action of those gates on Pauli operators
- Use the action to study effect on quantum error correcting codes
- Finally, restrict to gates that are reliable in the lab

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Qubit: Mathematically, it is a 2-dimensional vector space over  $\ensuremath{\mathbb{C}}$ 

 $\text{Pure state: } |\psi\rangle = \alpha \, |0\rangle + \beta \, |1\rangle \,, \text{ with } \alpha, \beta \in \mathbb{C} \text{ and } |\alpha|^2 + |\beta|^2 = 1 \\$ 

Example 
$$(n = 2 \text{ qubits})$$
:  $|0\rangle \otimes |1\rangle = \begin{bmatrix} 1 \\ 0 \end{bmatrix} \otimes \begin{bmatrix} 0 \\ 1 \end{bmatrix} = \begin{bmatrix} 0 \\ 1 \\ 0 \\ 0 \end{bmatrix} = |01\rangle$   
 $|1\rangle \otimes |0\rangle = \begin{bmatrix} 0 \\ 1 \end{bmatrix} \otimes \begin{bmatrix} 1 \\ 0 \end{bmatrix} = \begin{bmatrix} 0 \\ 0 \\ 1 \\ 0 \end{bmatrix} = |10\rangle$ 

Pure state (*n* qubits):  $|\phi\rangle = \sum_{v \in \mathbb{F}_2^n} \alpha_v |v\rangle$ ,  $\alpha_v \in \mathbb{C}$ ,  $\sum_{v \in \mathbb{F}_2^n} |\alpha_v|^2 = 1$ 

# Heisenberg-Weyl (or Pauli) Group HW<sub>N</sub>

Pure state (*n* qubits): 
$$|\phi\rangle = \sum_{v \in \mathbb{F}_2^n} \alpha_v |v\rangle$$
,  $\alpha_v \in \mathbb{C}$ ,  $\sum_{v \in \mathbb{F}_2^n} |\alpha_v|^2 = 1$   
 $HW_2 := \langle \imath^{\kappa} I, X, Z, Y | \quad \imath := \sqrt{-1}, \ \kappa \in \mathbb{Z}_4 \rangle$ ,  $I, X, Y, Z \in \mathbb{C}^{2 \times 2}$ 

$$\begin{array}{ll} \mathsf{Bit}\text{-}\mathsf{Flip}: & X \left| 0 \right\rangle = \left| 1 \right\rangle, \ X \left| 1 \right\rangle = \left| 0 \right\rangle \\ \mathsf{Phase}\text{-}\mathsf{Flip}: & Z \left| 0 \right\rangle = \left| 0 \right\rangle, \ Z \left| 1 \right\rangle = - \left| 1 \right\rangle \\ \mathsf{Bit}\text{-}\mathsf{Phase} \ \mathsf{Flip}: & Y \coloneqq \imath \cdot XZ, \ XZ = -ZX \end{array}$$

For *n* Qubits:  $HW_N :=$  Kronecker products of *n*  $HW_2$  matrices  $(N = 2^n)$ 

Example (n = 3):  $(X \otimes Z \otimes Y)(|0\rangle \otimes |1\rangle \otimes |1\rangle) = |1\rangle \otimes (-\iota |0\rangle) \otimes (-\iota |0\rangle)$ 

#### Important Fact

Pauli operators form an orthonormal basis for all  $N \times N$  matrices

## Pauli Group, Clifford Group and Symplectic Matrices

Heisenberg-Weyl Group 
$$HW_N := \{ \iota^{\kappa} E(a, b) : a, b \in \mathbb{F}_2^n, \kappa \in \mathbb{Z}_4 \}$$
  
 $E(a, b), a, b \in \mathbb{F}_2^n : \underbrace{X \otimes Z \otimes Y}_{n=3 \text{ qubits}} = E(\underbrace{101}_{a}, \underbrace{011}_{b}, \underbrace{011}_{b}, \underbrace{b=0 \quad 1 \quad 1}_{E(a, b)=X_1 \quad Z_2 \quad Y_3}$ 

Symplectic Inner Product:  $\langle [a, b], [c, d] \rangle_{s} \coloneqq [a, b] \Omega [c, d]^{T}, \Omega \coloneqq \begin{bmatrix} 0 & I_{n} \\ I_{n} & 0 \end{bmatrix}$ 

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Symplectic Inner Product: 
$$\langle [a, b], [c, d] \rangle_{s} \coloneqq [a, b] \Omega [c, d]^{T}, \Omega \coloneqq \begin{bmatrix} 0 & I_{n} \\ I_{n} & 0 \end{bmatrix}$$

Clifford Group: All unitaries that map Paulis to Paulis under conjugation

Symplectic Matrices: If  $g \in \text{Cliff}_N$  (Cliffords on  $n = \log_2 N$  qubits) then

$$g E(a, b) g^{\dagger} = \pm E([a, b]F_g), \text{ where } F_g \Omega F_g^T = \Omega$$

 $F_g \in \mathbb{F}_2^{2n \times 2n}$  is symplectic: preserves the symplectic inner product

# Pauli Group, Clifford Group and Symplectic Matrices

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# Two-Qubit Clifford: The Controlled-Z (CZ) Gate

$$g = CZ = \begin{bmatrix} 1 & & & \\ & 1 & & \\ & & 1 & \\ & & & -1 \end{bmatrix},$$

Symplectic Representation:  $gE(a, b)g^{\dagger} = \pm E([a, b]F_g)$ 

 $g(X \otimes I)g^{\dagger}$ 

$$= X \otimes Z$$
(or)  $CZ(X \otimes I) = (X \otimes Z)CZ$ 

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$$g(X \otimes I)g^{\dagger} = gE(10,00)g^{\dagger}$$
$$= E([10,00]F_g)$$
$$= E(10,01)$$
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# Two-Qubit Clifford: The Controlled-Z (CZ) Gate

$$g = \mathsf{CZ} = \begin{bmatrix} 1 & & & \\ & 1 & & \\ & & 1 & \\ & & & -1 \end{bmatrix}, F_g = \begin{bmatrix} I_2 & B_g \\ 0 & I_2 \end{bmatrix} = \begin{bmatrix} 1 & 0 & 0 & 1 \\ 0 & 1 & 1 & 0 \\ & & 1 & 0 \\ & & 0 & 1 \end{bmatrix}$$

Symplectic Representation:  $gE(a, b)g^{\dagger} = \pm E([a, b]F_g)$ 

$$g(X \otimes I)g^{\dagger} = gE(10,00)g^{\dagger}$$
$$= E([10,00]F_g)$$
$$= E(10,01)$$
$$= X \otimes Z$$
(or) CZ(X \otimes I) = (X \otimes Z)CZ

*r*-dimensional Stabilizer: Generated by *r* commuting Pauli operators:

$$S = \langle \epsilon_i E(a_i, b_i); i = 1, \dots, r \rangle, \ \epsilon_i \in \{\pm 1\}, \ -I_N \notin S$$

[n, k = n - r, d] Stabilizer Code: The 2<sup>k</sup> dimensional subspace, V(S), jointly fixed by all elements of S

$$V(S) \coloneqq \left\{ \ket{\psi} \in \mathbb{C}^{N} \colon g \ket{\psi} = \ket{\psi} \text{ for all } g \in S 
ight\}$$

Example:

Goal: Implement arbitrary unitary operations on the k encoded qubits

Break-it-down: Need to implement all Clifford gates and at least one non-Clifford gate on the *k* logical qubits

#### Starting Point

Algorithm for implementing any logical Clifford gate on any stabilizer code

- Understand action of Clifford gates on Pauli operators
- Use the action to study effect on quantum error correcting codes

# Logical Clifford Synthesis (LCS)



Synthesis of  $CZ_{12}^{L}$  for [6, 4, 2] Code

Implementation: https://github.com/nrenga/symplectic-arxiv18a

Paper: https://arxiv.org/abs/1907.00310

# Kerdock (Logical) Unitary 2-Design

2-Design: Unitary ensemble, matches Haar measure up to second moment

Kerdock Set  $P_{K}(n)$ : A specific collection of  $N = 2^{n}$  symmetric matrices

Kerdock Code K(n): Each (classical) codeword  $c_{P,w,\kappa} \in \mathbb{Z}_4^N$  is indexed by  $P \in P_K(n), w \in \mathbb{F}_2^n$ , and  $\kappa \in \mathbb{Z}_4$ ; so, totally  $2^{2n+2}$  codewords

Obtain graph states from all  $c_{P,w,\kappa}$  by mapping  $\mathbb{Z}_4 \mapsto \{1, i, -1, -i\}$  !

#### Main Result

The symmetry group of the graph states produces a unitary 2-design

Combining with the LCS algorithm produces a logical unitary 2-design! See https://arxiv.org/abs/1904.07842 for details

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## LCS: Exploit Action on Pauli Operators

Main Ideas in LCS: Use  $\bar{g} E(a, b) \bar{g}^{\dagger} = \pm E([a, b]F_{\bar{g}})$ 

- Implied logical action:  $g^L X_j^L (g^L)^{\dagger}, g^L Z_j^L (g^L)^{\dagger} \Rightarrow \bar{g} \bar{X}_j \bar{g}^{\dagger}, \bar{g} \bar{Z}_j \bar{g}^{\dagger}$
- $\bar{g} \in \text{Cliff}_N$  must map stabilizers to stabilizers under conjugation
- Translate conjugation relations into symplectic constraints on  $F_{\overline{g}}$

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- $\bar{g} \in \text{Cliff}_N$  must map stabilizers to stabilizers under conjugation
- Translate conjugation relations into symplectic constraints on  $F_{\overline{g}}$

Issues in generalizing to non-Clifford gates:

- Translating logical non-Cliffords to physical non-Cliffords is hard: there is no clear symplectic connection
- Physical operation is not Clifford ⇒ does not necessarily map stabilizers to stabilizers under conjugation

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## Gates for Universal Computation

 $\text{Cliff}_N = \langle H, P, \text{CZ or CNOT (on all qubits}) \rangle \leftarrow \text{Not universal!}$ 

Gate	Unitary Matrix	Action on Paulis	Symplectic Matrix
Hadamard	$H\coloneqq rac{1}{\sqrt{2}} egin{bmatrix} 1 & 1 \ 1 & -1 \end{bmatrix}$	$HXH^{\dagger} = Z$ $HZH^{\dagger} = X$	$F_H = \begin{bmatrix} 0 & 1 \\ 1 & 0 \end{bmatrix}$
Phase	$P := \begin{bmatrix} 1 & 0 \\ 0 & \imath \end{bmatrix} = \sqrt{Z}$	$PXP^{\dagger} = Y$ $PZP^{\dagger} = Z$	$F_P = \begin{bmatrix} 1 & 1 \\ 0 & 1 \end{bmatrix}$
Phase ( <i>P</i> ), Ctrl-Z (CZ)	$t_R \coloneqq \sum_{\mathbf{v} \in \mathbb{F}_2^n} \imath^{\mathbf{v} \mathcal{R} \mathbf{v}^{T}} \ket{\mathbf{v}} ra{\mathbf{v}} \ (\mathbf{v} \  \mathbf{v} \  \mathbf{v} \mathbf{v}^{T} \  ext{computed over } \mathbb{Z})$	$\begin{array}{c} CZ \colon X_a \mapsto X_a Z_b \\ Z_a \mapsto Z_a \end{array}$	$T_R = \begin{bmatrix} I_n & R \\ 0 & I_n \end{bmatrix}$ with R symmetric
Т	$T := egin{bmatrix} 1 & 0 \ 0 & e^{\imath \pi/4} \end{bmatrix} = \sqrt{P}$	$TXT^{\dagger} = \frac{X+Y}{\sqrt{2}}$ $TZT^{\dagger} = Z$	?
		_	

Gate	Unitary Matrix	Action on Paulis	Symplectic Matrix

Phase (P),  
Ctrl-Z (CZ)
$$t_{R} \coloneqq \sum_{v \in \mathbb{F}_{2}^{n}} i^{vRv^{T}} |v\rangle \langle v|$$
(vRv<sup>T</sup> computed over Z)
$$CZ: X_{a} \mapsto X_{a}Z_{b}$$

$$T_{R} = \begin{bmatrix} I_{n} & R \\ 0 & I_{n} \end{bmatrix}$$
with R symmetric

$$T T := \begin{bmatrix} 1 & 0 \\ 0 & e^{i\pi/4} \end{bmatrix} = \sqrt{P} TXT^{\dagger} = \frac{X+Y}{\sqrt{2}} ?$$
$$TZT^{\dagger} = Z$$

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# Quadratic Form Diagonal (QFD) Gates

S.X. Cui, D. Gottesman and A. Krishna, Phys. Rev. A, 2017 If  $U \in C^{(\ell)}$  is diagonal, then all entries are  $2^{\ell}$ -th roots of unity.

Examples:

$$P \in \mathcal{C}^{(2)} \leftrightarrow R = \llbracket 1 
bracket$$
 over  $\mathbb{Z}_4$ 

$$\mathcal{C}^{(2)}: t_{R} = \sum_{v \in \mathbb{F}_{2}^{n}} i^{v R v^{T}} |v\rangle \langle v|$$

$$\begin{cases} R \text{ is } n \times n \text{ symmetric} \\ \text{with entries in } \mathbb{Z}_{2} \end{cases}$$

$$\mathcal{C}^{(1)} = HW_{N}$$

$$\begin{aligned} \mathsf{CZ} &= \mathsf{diag}\left[1, 1, 1, -1\right] \in \mathcal{C}^{(2)} \\ &\leftrightarrow R = \begin{bmatrix} 0 & 1 \\ 1 & 0 \end{bmatrix} \text{ over } \mathbb{Z}_4 \end{aligned}$$
# Quadratic Form Diagonal (QFD) Gates

S.X. Cui, D. Gottesman and A. Krishna, Phys. Rev. A, 2017 If  $U \in C^{(\ell)}$  is diagonal, then all entries are  $2^{\ell}$ -th roots of unity.

$$\mathcal{C}^{(\ell)} : \tau_{R}^{(\ell)} = \sum_{v \in \mathbb{F}_{2}^{n}} \xi^{vRv^{T}} |v\rangle \langle v|$$

$$\begin{vmatrix} R \text{ is } n \times n \text{ symmetric} \\ \text{with entries in } \mathbb{Z}_{2^{\ell}}, \\ \xi = \exp\left(\frac{2\pi i}{2^{\ell}}\right) \end{vmatrix}$$

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Examples:

$$P \in \mathcal{C}^{(2)} \leftrightarrow R = [1] ext{ over } \mathbb{Z}_4$$
  
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$$CZ = diag [1, 1, 1, -1] \in C^{(2)}$$
  

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$$CP = diag [1, 1, 1, i] \in C^{(3)}$$
  

$$\leftrightarrow R = \begin{bmatrix} 0 & 1 \\ 1 & 0 \end{bmatrix} \text{ over } \mathbb{Z}_8$$

## Diagonal Recursion for QFD Gates

Recollect: Clifford g acts as  $g E(a, b) g^{\dagger} = \pm E([a, b]F_g)$ ,  $F_g$  symplectic How do QFD gates act on Pauli matrices under conjugation?

$$\tau_{R}^{(\ell)} \mathsf{E}(\mathsf{a}, \mathsf{b}) \left(\tau_{R}^{(\ell)}\right)^{\dagger} = \phi(\mathsf{R}, \mathsf{a}, \mathsf{b}, \ell) \cdot \mathsf{E}\left(\left[\mathsf{a}, \mathsf{b}\right] \begin{bmatrix} \mathsf{I}_{n} & \mathsf{R} \\ \mathsf{0} & \mathsf{I}_{n} \end{bmatrix}\right) \cdot \tau_{\tilde{\mathsf{R}}(\mathsf{R}, \mathsf{a}, \ell)}^{(\ell-1)}$$

 $\phi(R, a, b, \ell)$ : Deterministic global phase  $\tilde{R}(R, a, \ell)$ : New symmetric matrix with entries in  $\mathbb{Z}_{2^{\ell-1}}$  Recollect: Clifford g acts as  $g E(a, b) g^{\dagger} = \pm E([a, b]F_g)$ ,  $F_g$  symplectic How do QFD gates act on Pauli matrices under conjugation?

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 $\phi(R, a, b, \ell)$ : Deterministic global phase  $\tilde{R}(R, a, \ell)$ : New symmetric matrix with entries in  $\mathbb{Z}_{2^{\ell-1}}$ 

All 1- and 2-local diagonal gates in  $C^{(\ell)}$  are QFD for any  $\ell \geq 1$ Mølmer-Sørensen gates  $MS(\frac{\pi}{2^{\ell}})$  are QFD up to Hadamards

For details see: https://arxiv.org/abs/1902.04022

### Synthesizing Logical Operators for Stabilizer Codes

- Motivation and Strategy
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- Introduction and Motivation
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Goal: Implement arbitrary unitary operations on the k encoded qubits

Break-it-down: Need to implement all Clifford gates and at least one non-Clifford gate on the k logical qubits

### Synthesizing logical non-Cliffords is hard

First explore how physical non-Clifford gates affect the code subspace

- Understand action of non-Clifford gates on Pauli operators
- Use the action to study effect on quantum error correcting codes

## LCS: Exploit Action on Pauli Operators

Main Ideas in LCS:

- Implied logical action:  $g^L X_j^L (g^L)^{\dagger}, g^L Z_j^L (g^L)^{\dagger} \Rightarrow \bar{g} \bar{X}_j \bar{g}^{\dagger}, \bar{g} \bar{Z}_j \bar{g}^{\dagger}$
- $\bar{g} \in \text{Cliff}_N$  must map stabilizers to stabilizers under conjugation
- Translate conjugation relations into symplectic constraints on  $F_{\overline{g}}$

### Issues in generalizing to $C^{(\ell)}, \ell > 2$ :

- Translating logical non-Cliffords to physical non-Cliffords is hard: there is no clear symplectic connection.
- Physical operation is not Clifford ⇒ does not necessarily map stabilizers to stabilizers.

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### Issues in generalizing to $C^{(\ell)}, \ell > 2$ :

- Translating logical non-Cliffords to physical non-Cliffords is hard: there is no clear symplectic connection. QFD Gates!
- Physical operation is not Clifford ⇒ does not necessarily map stabilizers to stabilizers. Preserve projector onto code subspace!

## Reverse LCS Strategy for Physical T Gates

### QECC: Quantum Error Correcting Code



What stabilizer structure is required so that the physical application of T gates preserves the code subspace?

### Transversal T as a Logical Operator

Question: When is transversal T a logical operator for a stabilizer code? What is the induced logical operation?

Stabilizer: 
$$S = \langle \epsilon_i E(a_i, b_i); i = 1, 2, ..., r \rangle, \epsilon_i \in \{\pm 1\}$$
  
Code Projector:  $\Pi_s = \prod_{i=1}^r \frac{I_N + \epsilon_i E(a_i, b_i)}{2} = \frac{1}{2^r} \sum_{a,b \in S} \epsilon_{a,b} E(a, b)$ 

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Calculation using QFD recursion [hard for general QFD!]

$$T^{\otimes n}E(a,b)\left(T^{\otimes n}\right)^{\dagger}=\frac{1}{2^{\operatorname{wt}_{H}(a)/2}}\sum_{y\preceq a}(-1)^{by^{T}}E(a,b\oplus y)$$

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 $T^{\otimes n}$  is a logical operator iff  $T^{\otimes n}\Pi_{S}(T^{\otimes n})^{\dagger} = \Pi_{S}$ : [also hard in general!]

$$\frac{1}{2^r}\sum_{a,b\in S}\frac{\epsilon_{a,b}}{2^{\mathsf{wt}_H(a)/2}}\sum_{y\preceq a}(-1)^{by^T}E(a,b\oplus y)=\frac{1}{2^r}\sum_{a,b\in S}\epsilon_{a,b}E(a,b)$$

### CSS-T Codes and Two Corollaries

CSS-T Codes: Pair  $(C_1, C_2)$  of codes satisfying  $C_2 \subset C_1$  and the following:

**1** All codewords  $x \in C_2$  have even Hamming weight  $w_H(x)$ .

For each x ∈ C<sub>2</sub>, C<sub>1</sub><sup>⊥</sup> consists of a dimension w<sub>H</sub>(x)/2 self-dual code Z<sub>x</sub> supported on x (i.e., Z<sub>x</sub> is essentially a [w<sub>H</sub>(x), w<sub>H</sub>(x)/2] code).

This yields a quantum code with parameters  $[n, k_1 - k_2, d \ge \min(d_1, d_2^{\perp})]$ .

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Two Corollaries: (Non-degenerate  $\Rightarrow$  each stabilizer has weight  $\geq d$ )

**9** Triorthogonal codes form the only CSS family with  $T^{\otimes n} \equiv \overline{T}^{\otimes k}$ .

For each [[n, k, d]] non-degenerate stabilizer code that supports transversal T, there is an [[n, k, d]] CSS-T code that does too.

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This yields a quantum code with parameters  $[n, k_1 - k_2, d \ge \min(d_1, d_2^{\perp})]$ .

### **Open Problem**

A CSS-T family with 
$$\frac{(k_1-k_2)}{n} = \Omega(1)$$
 and  $\frac{d}{n} = \Omega(1)$ 

Would imply constant overhead magic state distillation!  $\left[\gamma = \frac{\log(n/k)}{\log d}\right]$  (see arXiv:1910.09333, or arXiv:2001.04887 for shorter version)

• Reviewed the Logical Clifford Synthesis (LCS) algorithm

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  - All 1- and 2-local diagonal gates in the hierarchy are QFD
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  - Paper: Extensions to finer angle Z-rotations and Reed-Muller codes

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  - Paper: Extensions to finer angle Z-rotations and Reed-Muller codes
- Use our recipe to find codes supporting any reliable QFD gate?

#### Key Takeaway

Expressing unitaries in the Pauli basis seems like an under-utilized trick

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### 2 Classical Communications over Pure-State Channels

- Introduction and Motivation
- Classical Belief-Propagation (BP)
- Belief-Propagation with Quantum Messages (BPQM)

- To compute quantities related to problems defined on graphs
- They work by passing messages between nodes of the graph

### Belief-Propagation (BP)

A message passing algorithm to efficiently compute posterior marginal distributions in statistical inference problems

- BP exactly performs bit-wise (or variable-wise) maximum-a-posteriori (bit-MAP) estimation when the underlying graph is a tree
- When the graph has cycles, usually run BP for a fixed number of iterations; it converges in many cases, e.g., LDPC codes

Belief-Propagation (BP): A message passing algorithm to efficiently compute posterior marginal distributions in statistical inference problems

- How to define BP so that it passes quantum messages?
- Why do we care? Might provide significant advantages in classical communications over quantum channels
- [Ren17]: A BP algorithm that passes qubits (and classical bits) as messages; helps decode binary linear codes (with tree factor graphs) on pure-state channels – BP with Quantum Messages (BPQM)

### This Talk

Description, performance, of BPQM with a 5-bit tree code as example

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An [n, k, d] code C can be defined by a binary parity-check matrix H as:

$$\mathcal{C} := \{ \underline{x} \in \{0,1\}^n \colon H\underline{x}^T = \underline{0}^T, \ H \in \{0,1\}^{(n-k) \times n} \}$$

It encodes k message bits into n code bits, the minimum Hamming weight of any codeword  $\underline{x} \in C$  is d. Running Example: [5, 3, 2] code defined by



$$p(\underline{x}|\underline{y}) = \frac{p(\underline{y}|\underline{x}) \cdot p(\underline{x})}{\sum_{\underline{x} \in \{0,1\}^5} p(\underline{y}|\underline{x}) \cdot p(\underline{x})} \qquad \qquad x_1 \quad x_2 \quad x_3 \quad x_4 \quad x_5 \\ H = \begin{array}{c} c_1 \\ c_2 \\ 1 & 0 & 0 & 1 & 1 \end{array} \right)$$

$$\propto \prod_{k=1} W(y_k|x_k) \cdot [\mathbb{I}(x_1 \oplus x_2 \oplus x_3 = 0) \, \mathbb{I}(x_1 \oplus x_4 \oplus x_5 = 0)]$$

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$$\propto \prod_{k=1}^{\infty} W(y_k|x_k) \cdot [\mathbb{I}(x_1 \oplus x_2 \oplus x_3 = 0) \mathbb{I}(x_1 \oplus x_4 \oplus x_5 = 0)]$$

$$= W(y_1|x_1) \cdot [\mathbb{I}(x_1 \oplus x_2 \oplus x_3 = 0)W(y_2|x_2)W(y_3|x_3)] \\ \cdot [\mathbb{I}(x_1 \oplus x_4 \oplus x_5 = 0)W(y_4|x_4)W(y_5|x_5)],$$

Problem: Transmit codeword  $\underline{x} \in C$  through  $W^n$ , receive vector  $\underline{y} \in \mathcal{Y}^n$ , optimally estimate the sent codeword  $\underline{\hat{x}} \in C$  given observation y

$$\propto \prod_{k=1}^{\circ} W(y_k|x_k) \cdot [\mathbb{I}(x_1 \oplus x_2 \oplus x_3 = 0) \mathbb{I}(x_1 \oplus x_4 \oplus x_5 = 0)]$$

$$= W(y_1|x_1) \cdot [\mathbb{I}(x_1 \oplus x_2 \oplus x_3 = 0)W(y_2|x_2)W(y_3|x_3)] \\ \cdot [\mathbb{I}(x_1 \oplus x_4 \oplus x_5 = 0)W(y_4|x_4)W(y_5|x_5)],$$

 $\hat{\underline{x}}^{\mathsf{MAP}} := \underset{\underline{x} \in \{0,1\}^{5}}{\mathsf{argmax}} p(\underline{x}|\underline{y}) \longleftarrow \mathsf{Block}\mathsf{-MAP}$ 

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# Bit-MAP and Belief-Propagation (BP)

Block-MAP is optimal but has exponentially growing complexity in kBit-MAP marginalizes the joint posterior and makes a decision bit-wise



Narayanan Rengaswamy (Duke) Classical Coding for Quantum Applications Ph.D. Defense: March 18, 2020 30 / 40

# Bit-MAP and Belief-Propagation (BP)

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Variable Node Convolution: The transition probabilities of this channel are

 $[W \circledast W'](y, z|x) = W(y|x) \cdot W'(z|x, y) = W(y|x) \cdot W'(z|x)$ 



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Factor Node Convolution: The transition probabilities of this channel are

$$[W \boxtimes W'](y, z|x) = \frac{1}{2}W(y|u = x) \cdot W'(z|v = 0) + \frac{1}{2}W(y|u = x \oplus 1) \cdot W'(z|v = 1)$$
$$= \frac{1}{2}W(y|x) \cdot W'(z|0) + \frac{1}{2}W(y|x \oplus 1) \cdot W'(z|1)$$
$$(x) = (y, z)$$

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$$w = (y, z)$$
  
$$\sum_{\substack{x_2, x_3 \in \{0,1\}^2 \\ = W(y_2|x_2 = x_1)W(y_3|x_3 = 0) + W(y_2|x_2 = x_1 \oplus 1)W(y_3|x_3 = 1)$$
  
$$\propto [W \boxtimes W](y_2, y_3|x_1),$$

## Generalized Channel Convolutions [Ren17; Ren18]

Classical Channels  $W(y|x) := \mathbb{P}[Y = y|X = x]$ :

$$egin{aligned} & [W \circledast W'](y,z|x) \coloneqq \mathcal{W}(y|x) \cdot \mathcal{W}'(z|x), \ & [W \circledast W'](y,z|x) \coloneqq rac{1}{2}\mathcal{W}(y|x) \cdot \mathcal{W}'(z|0) + rac{1}{2}\mathcal{W}(y|x \oplus 1) \cdot \mathcal{W}'(z|1) \end{aligned}$$

Classical-Quantum Channels  $W(x), x \in \{0, 1\}$ :

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How do we generalize BP w.r.t. these channel convolutions?

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# Pure-State CQ Channel

Defined for classical inputs  $x \in \{0,1\}$  as

$$\begin{split} W(x) &:= \langle x | 0 \rangle \cdot | \theta \rangle \langle \theta | + \langle x | 1 \rangle \cdot | -\theta \rangle \langle -\theta | \\ &= |(-1)^{x} \theta \rangle \langle (-1)^{x} \theta | , \\ |\pm \theta \rangle &:= \cos \frac{\theta}{2} | 0 \rangle \pm \sin \frac{\theta}{2} | 1 \rangle \end{split}$$

Fidelity of the channel:  $F(W) := |\langle \theta | - \theta \rangle|^2 = \cos^2 \theta$ 

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Fidelity of the channel:  $F(W) := |\langle \theta | - \theta \rangle|^2 = \cos^2 \theta$ Let  $q := \mathbb{P}[x = 0]$ . Then the joint density matrix is

$$ho_{XB}\coloneqq q\cdot \ket{0}ra{0}_X\otimes \ket{ heta}ra{ heta}_B + (1-q)\cdot \ket{1}ra{1}_X\otimes \ket{- heta}ra{- heta}_B.$$

The capacity is attained at q = 1/2 and is given by [GW12]

$$\mathcal{C}_{\infty}(W) = \mathcal{H}\left(rac{1}{2} \cdot \ket{ heta}ra{ heta}|_B + rac{1}{2} \cdot \ket{- heta}ra{- heta}|_B
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# Helstrom Measurement [Hel69; HLG70]

An optimal measurement to distinguish between any two states  $\rho_0, \rho_1$ . It is defined by the projectors  $\{\Pi_{\text{Hel}}, \mathbb{I} - \Pi_{\text{Hel}}\}$ :

$$\Pi_{\mathsf{Hel}} \coloneqq \sum_{i: \ \lambda_i \ge 0} |i\rangle \langle i|, \ (\rho_0 - \rho_1) |i\rangle = \lambda_i |i\rangle.$$

For the pure state channel, for any  $\theta$ , easy to see that

$$\rho_0 - \rho_1 = |\theta\rangle \langle \theta| - |-\theta\rangle \langle -\theta| = \sin \theta \cdot X,$$

so the Helstrom measurement is projecting onto the Pauli X basis, i.e., the projectors are  $\{|+\rangle \langle +|, |-\rangle \langle -|\}$ .

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$$\Pi_{\mathsf{Hel}} \coloneqq \sum_{i: \ \lambda_i \ge 0} |i\rangle \langle i|, \ (\rho_0 - \rho_1) |i\rangle = \lambda_i |i\rangle.$$

For the pure state channel, for any  $\theta$ , easy to see that

$$\rho_0 - \rho_1 = |\theta\rangle \langle \theta| - |-\theta\rangle \langle -\theta| = \sin \theta \cdot X,$$

so the Helstrom measurement is projecting onto the Pauli X basis, i.e., the projectors are  $\{|+\rangle \langle +|, |-\rangle \langle -|\}$ . Optimal error probability: ([Dol73])

$$P_{\min} = \frac{1}{2} - \frac{1}{4} \left\| \rho_0 - \rho_1 \right\|_1 = \frac{1 - \sqrt{1 - F(W)}}{2} = \frac{1 - \sin \theta}{2}$$

Hence, the Helstrom measurement induces the channel  $BSC(P_{min})$ .

Capacity under symbol-by-symbol Helstrom Measurement:

$$\mathcal{C}_1(W)=1-h_2(\mathcal{P}_{\min})=1-h_2\left(rac{1-\sqrt{1-\mathcal{F}(W)}}{2}
ight)\ll\mathcal{C}_\infty(W).$$

Ultimate Holevo Capacity  $C_{\infty}(W)$  requires collective measurements!

Classical-Quantum Polar Codes close this gap but the quantum successive cancellation decoder is infeasible to realize in practice [WG13].

Capacity under symbol-by-symbol Helstrom Measurement:

$$C_1(W) = 1 - h_2(P_{\min}) = 1 - h_2\left(\frac{1 - \sqrt{1 - F(W)}}{2}\right) \ll C_{\infty}(W).$$

Ultimate Holevo Capacity  $C_{\infty}(W)$  requires collective measurements!

Classical-Quantum Polar Codes close this gap but the quantum successive cancellation decoder is infeasible to realize in practice [WG13].

1. Is it possible to define a quantum BP decoder that closes this gap?

2. Given a code, how to define quantum BP for optimal block error rate?

## Generalized Channel Convolutions [Ren17; Ren18]

Classical Channels  $W(y|x) := \mathbb{P}[Y = y|X = x]$ :

$$egin{aligned} & [W \circledast W'](y,z|x) \coloneqq \mathcal{W}(y|x) \cdot \mathcal{W}'(z|x), \ & [W \circledast W'](y,z|x) \coloneqq rac{1}{2}\mathcal{W}(y|x) \cdot \mathcal{W}'(z|0) + rac{1}{2}\mathcal{W}(y|x \oplus 1) \cdot \mathcal{W}'(z|1) \end{aligned}$$

Classical-Quantum Channels  $W(x), x \in \{0, 1\}$ :

$$egin{aligned} & [W \circledast W'](x) \coloneqq W(x) \otimes W'(x), \ & [W \trianglerighteq W'](x) \coloneqq rac{1}{2} W(x) \otimes W'(0) + rac{1}{2} W(x \oplus 1) \otimes W'(1) \end{aligned}$$

How do we generalize BP w.r.t. these channel convolutions?

# BPQM on the 5-bit Code

**BPQM** Node Operations:

$$\begin{split} U_{\circledast}(\theta,\theta')\big([W \circledast W'](x)\big) U_{\circledast}(\theta,\theta')^{\dagger} &= \left|\pm\theta^{\circledast}\right\rangle \left\langle\pm\theta^{\circledast}\right| \otimes \left|0\right\rangle \left\langle0\right|,\\ U_{\mathbb{B}}\big([W \circledast W'](x)\big) U_{\mathbb{B}}^{\dagger} &= \sum_{j \in \{0,1\}} p_{j} \left|\pm\theta_{j}^{\mathbb{B}}\right\rangle \left\langle\pm\theta_{j}^{\mathbb{B}}\right| \otimes \left|j\right\rangle \left\langle j\right| \end{split}$$

Apply BPQM operations to decode bit  $x_1$  of the code:



#### Full BPQM Circuit for the 5-bit Code



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# BPQM Performance for the 5-bit Code

Optimal: Joint Helstrom msmt. to distinguish the 8 codewords [YKL75]



Narayanan Rengaswamy (Duke)

# Summary and Open Questions

- BP: Performs local inference over locally induced channels
- BPQM: Locally defined algorithm based on generalized channel convolutions; passes qubits as messages on the factor graph
- BPQM appears to be quantum optimal for the 5-bit code

# Summary and Open Questions

- BP: Performs local inference over locally induced channels
- BPQM: Locally defined algorithm based on generalized channel convolutions; passes qubits as messages on the factor graph
- BPQM appears to be quantum optimal for the 5-bit code
- Prove BPQM optimality for codes with tree factor graphs?
- Does the quantum advantage persist under current gate fidelities?
- BP aims to compute posterior marginals, but goal of BPQM remains unclear since quantum "posteriors" are ill-defined

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# Thank you!

LCS Algorithm: https://arxiv.org/abs/1907.00310 Code at https://github.com/nrenga/symplectic-arxiv18a

QFD Gates: https://arxiv.org/abs/1902.04022

CSS-T Codes: https://arxiv.org/abs/1910.09333

Kerdock 2-Design: https://arxiv.org/abs/1904.07842 Code at https://github.com/nrenga/symplectic-arxiv18a

BPQM: https://arxiv.org/abs/2003.04356