# PHOENIX: Pauli-Based High-Level Optimization Engine for Instruction Execution on NISQ Devices

**Zhaohui Yang**<sup>1</sup>, Dawei Ding<sup>2</sup>, Chenghong Zhu<sup>3</sup>, Jianxin Chen<sup>4</sup>, Yuen Xie<sup>1</sup>

<sup>1</sup>Department of Electronic and Computer Engineering, The Hong Kong University of Science and Technology, Hong Kong

<sup>2</sup>Yau Mathematical Sciences Center, Tsinghua University, Beijing, China

<sup>3</sup>The Hong Kong University of Science and Technology (Guangzhou), Guangzhou, China

<sup>4</sup>Department of Computer Science and Technology, Tsinghua University, Beijing, China





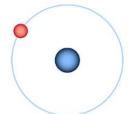


# Quantum computing for Hamiltonian simulation problems

Goal: Molecular properties of drugs and materials

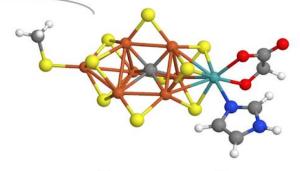
Difficult: Exponential state space requirements Use a QC to simulate a quantum system!





$$H = \begin{pmatrix} \alpha_{1,1} & \alpha_{1,2} \\ \alpha_{2,1} & \alpha_{2,2} \end{pmatrix}$$

Increasing complexity

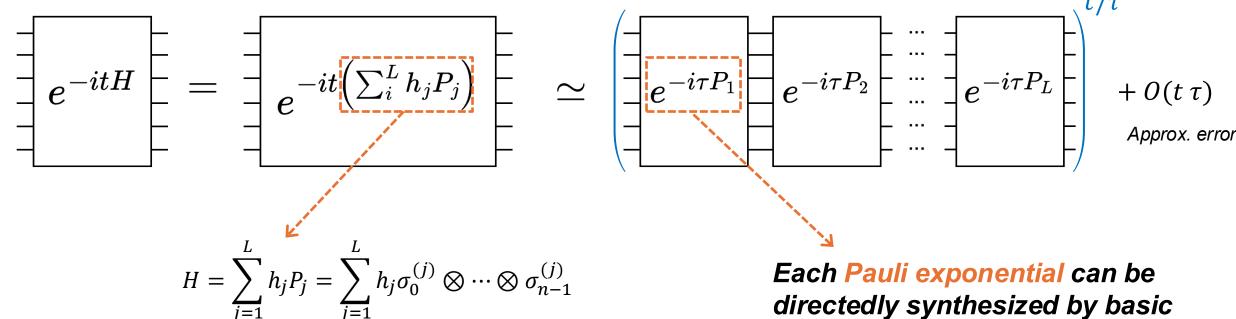


$$H = \begin{pmatrix} \alpha_{1,1} & \cdots & \alpha_{1,2^n} \\ \vdots & \ddots & \vdots \\ \alpha_{2^n,1} & \cdots & \alpha_{2^n,2^n} \end{pmatrix}$$



# How to simulate the unitary evolution governed by a system Hamiltonian?

Product formula for approximate simulation with circuits



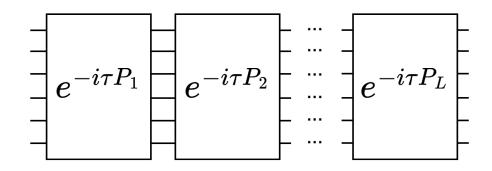
Hamiltonian as "linear combination" of Pauli operators

 $\sigma_i$  is basic 2x2 Pauli matrix:

$$I = \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix}, X = \begin{bmatrix} 0 & 1 \\ 1 & 0 \end{bmatrix}, Y = \begin{bmatrix} 0 & -i \\ i & 0 \end{bmatrix}, \text{ or } Z = \begin{bmatrix} 1 & 0 \\ 0 & -1 \end{bmatrix}$$

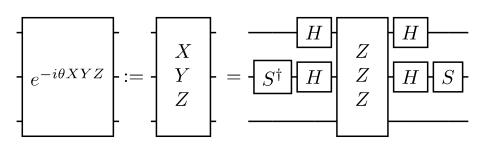
Each Pauli exponential can be directedly synthesized by basic 1Q and 2Q gates

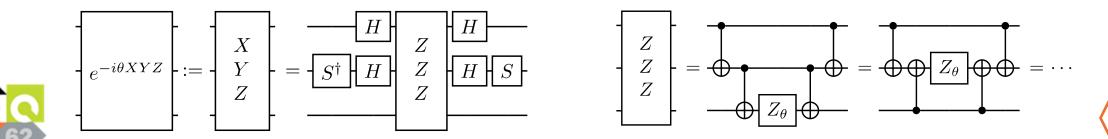
# Basic synth. of Pauli exponentials (IRs)



- Pauli exponential as IR (intermediate representation)  $P_i = h_i \sigma_0^{(j)} \otimes \cdots \otimes \sigma_{n-1}^{(j)}$
- IR synthesis → basic 1Q and 2Q gates

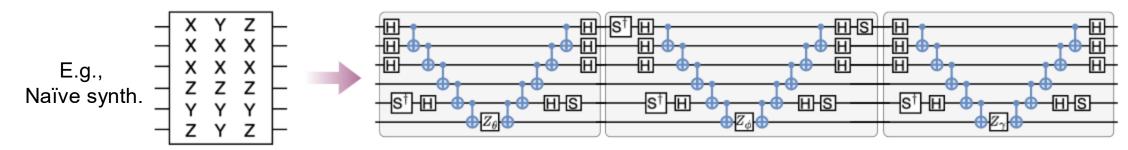




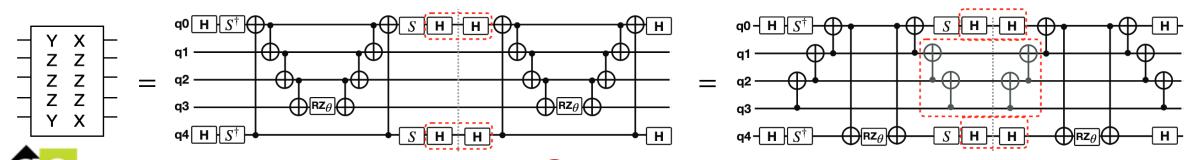


# Problem statement for IRs synth. & Opt.

Compilation goal: As less basic quantum gates (especially 2Q gates) as possible



- Previous optimization methods
  - Gate cancellation opportunities through 1) variational IR arrangement, 2) IR synth. variants
  - E.g., [TKet, Cowtan+2020], [PauliOpt, Griend+2023], [Paulihedral, Li+ASPLOS'22], [Tetris, Jin+ISCA'24]



E.g., Synth. Strategy in Paulihedral/Tetris

Local optimization (limited opt. space & complicated tricks)

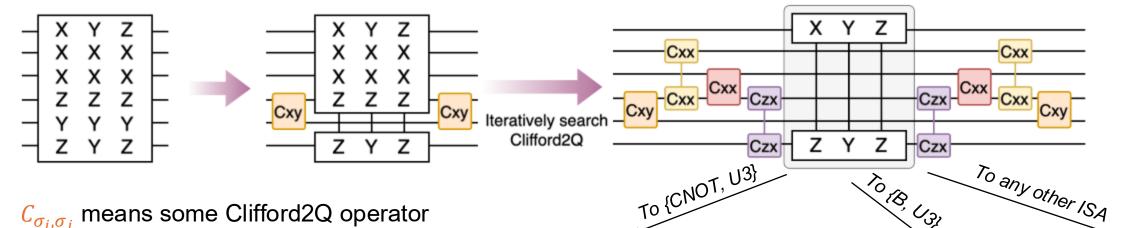


**Dependent on CNOT tree unrolling** 

# Is there any efficient synthesis approach?

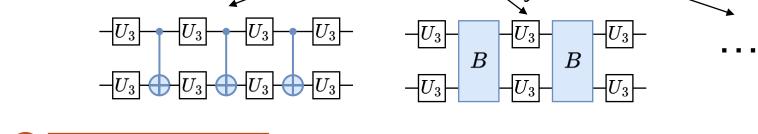
#### Insight of our optimization method

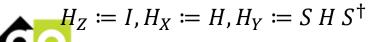
Simultaneous Pauli strings simplification via Clifford conjugations

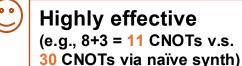


 $C_{\sigma_i,\sigma_i}$  means some Clifford2Q operator

E.g., 
$$C_{\sigma_i,\sigma_j} = H_{\sigma_i} - H_{\sigma_i} - H_{\sigma_j}$$









Global opt.: Simult. Paulis simp.



**ISA** independent

Cxx

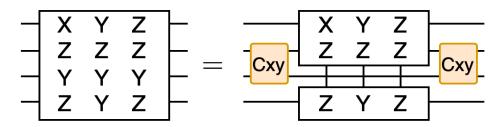
#### **Problem formulation**

Reformulate the synthesis process: Pauli exp. synthesis -> Clifford transformation on Paulis

Clifford formalism

$$oxed{X} = oxed{Czx} oxed{Zzx}$$

One Pauli string -> another Pauli string



A set of Pauli string → another set of Pauli strings

- Formal IR description: Binary symplectic form (BSF)
  - j-th component of i-th Pauli  $\rightarrow [X_{i,j}; Z_{i,j}]$  (e.g., X is [1,0], Y is [1,1])
  - Accommodate Global High-level info.

*X*-part mat. *Z*-part mat.

X-part mat. Z-part mat.

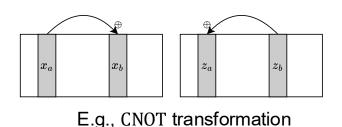
$$\begin{bmatrix}
0 & 1 & 0 & 1 & 1 & 0 \\
0 & 0 & 0 & 1 & 1 & 0 \\
1 & 1 & 0 & 0 & 1 & 0 \\
1 & 0 & 0 & 0 & 1 & 0
\end{bmatrix}
\begin{array}{c|ccccc}
ZYI \\
ZZI \\
XYI \\
XZI \\
Q_1 & Q_2 & Q_3 & Q_1 & Q_2 & Q_3
\end{array}$$



#### **Problem formulation**

Reformulate the synthesis process: Pauli exp. synthesis -> Clifford transformation on Paulis

Clifford formalism as binary operation on column vectors of BSF tableau



$$\begin{bmatrix} 0 & 1 & 1 & 1 & 1 & 1 \\ 0 & 0 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 0 & 1 & 1 \\ 1 & 0 & 1 & 0 & 1 & 1 \end{bmatrix} \xrightarrow{C(X,Y)_{1,2}} \begin{bmatrix} 0 & 1 & 0 & 1 & 1 & 0 \\ 0 & 0 & 0 & 1 & 1 & 0 \\ 1 & 1 & 0 & 0 & 1 & 0 \\ 1 & 0 & 0 & 0 & 1 & 0 \end{bmatrix}$$

E.g., Clifford 
$$C(X,Y)$$
:  $[x_a, x_b \mid z_a, z_b] \rightarrow [x_a \oplus x_b \oplus z_b, z_a \oplus z_b \mid z_a, z_a \oplus z_b]$ 

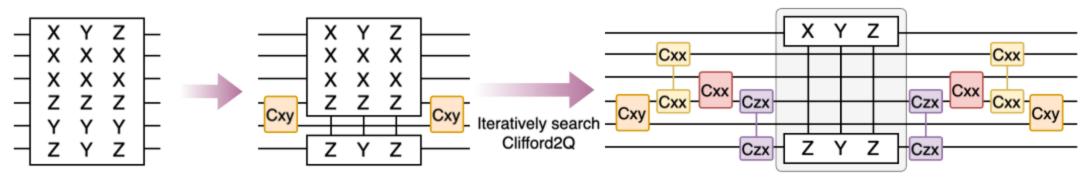
- Optimization goal:
  - When  $w_{\text{tot.}} \coloneqq \left| \bigvee_i \left( r_x^{(i)} \vee r_z^{(i)} \right) \right|$  is at most 2 (directly synthesized by basic 1Q/2Q gates)

$$\begin{bmatrix} Z & Z & X & X \\ Y & Z & Y & Z \end{bmatrix} - \begin{bmatrix} 0 & 1 & 0 & 1 & 1 & 0 \\ 0 & 0 & 0 & 1 & 1 & 0 \\ 1 & 1 & 0 & 0 & 1 & 0 \\ 1 & 0 & 0 & 0 & 1 & 0 \end{bmatrix}$$
E.g.,  $w_{\text{tot.}} = 2$ 

Now the key is: How to search for the most appropriate
 Clifford2Q for BSF simplification?

# **BSF** simplification algorithm

- A cost function: disparity between current BSF and optimization goal
  - A sophisticated metric heuristically designed. See paper for details.
- Heuristic Clifford2Q search: Greedily search for the most appropriate one
  - Select from  $\left\{\mathcal{C}_{\sigma_i,\sigma_j}\right\} \times \left\{(q_m,q_n)\right\}$  that mostly minimize the cost function
  - Apply the selected Clifford2Q; Peel 1Q Pauli rotations before each search step
  - Iterate, until  $w_{\text{tot.}}$  is less than 2





E.g., Targe unitary evolution (snippet from H4 UCCSD):  $e^{-i(0.1*XXXZYZ+0.2*YXXZYY+0.3*ZXXZYZ)}$ 

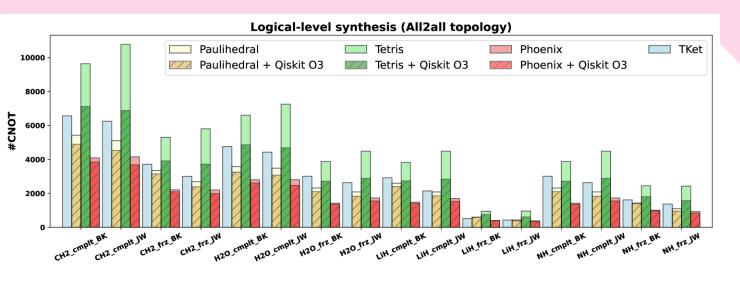
Final result

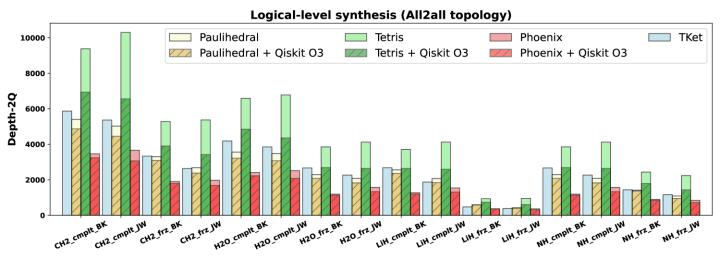
#### Moreover

- In PHOENIX (Pauli-based High-level Optimization ENgine for Instruction eXecution), we design
  - BSF as formal description (preserve high-level global info of IRs)
  - Formulate IR synth. & opt. as "simultaneously lowering weights" of BSF tableau by Clifford2Q (global opt.; ISA-independent)
  - BSF simplification algorithm as the core optimization pass (highly effective; polynomial complexity)
  - Extra opt. points: Assemble simplified IR groups, gate cancellation, lowering depth
- See paper for details



#### **Evaluation: Main results**





Benchmarks: 16 molecule simulation programs

AVERAGE (GEOMETRIC-MEAN) OPTIMIZATION RATES ON UCCSD.

Compiler	#CNOT opt.	Depth-2Q opt.		
ТКет	33.07%	30.14%		
PAULIHEDRAL	28.41%	29.07%		
PAULIHEDRAL + O3	25.72%	26.3%		
TAULIHEDRAL + O3	(-8.54% v.s. no O3)	(-8.6% v.s. no O3)		
TETRIS	53.66%	53.26%		
Tetris + O3	36.73%	36.37%		
TEIRIS + O3	(-30.94% v.s. no O3)	(-31.08% v.s. no O3)		
PHOENIX	21.12%	19.29%		
PHOENIX + O3	19.53%	17.28%		
	(- <b>6.64</b> % v.s. no O3)	(- <b>8.51%</b> v.s. no O3)		

- Hardware-agnostic compilation benchmarking
  - Baselines: [<u>Tket, Cowtan+2020</u>], [<u>Paulihedral, Li+ASPLOS'22</u>), [<u>Tetris, Jin+ISCA'24</u>]
- Phoenix significantly outperforms other SOTAs
- Phoenix's high-level optimization leaves the least optimization space for local optimization (Qiskit O3)



#### Conclusion

- Contributions: PHOENIX, a high-level VQA application-specific compiler
  - Formal description by BSF; Problem modeling via BSF tableau update by Cliford2Q;
     Heuristic algorithms
  - ISA-independent (CNOT/B/SQiSW; Clifford2Q could even be iSWAP-equivalent other than CZ-equivalent ones)
  - High-level & global optimization (Highly effective; scalable)
  - Outperforms other SOTAs across diverse VQA applications, device topologies, and backend ISAs (more evaluation details in paper)
- Future directions
  - Deep co-optimization (e.g., topology-aware opt.)?
    - BSF as formal description leveraged for stabilizer circuit optimization?





# **Zhaohui Yang**

PhD student





Thanks for listening!



# **Backup slides**



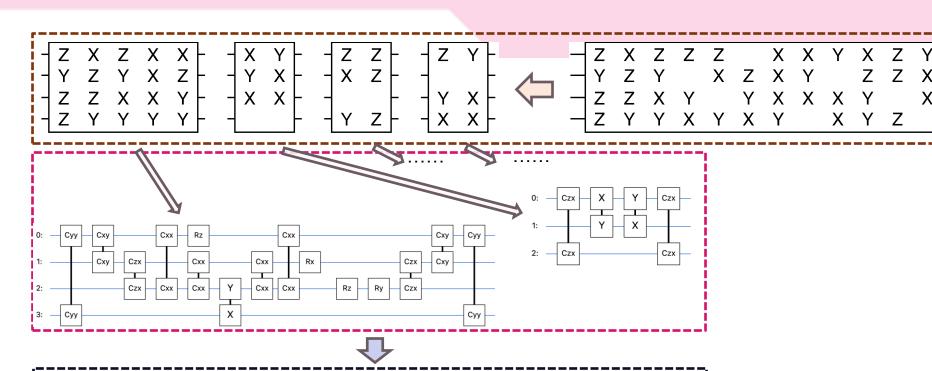






# End-to-end workflow and further opt.



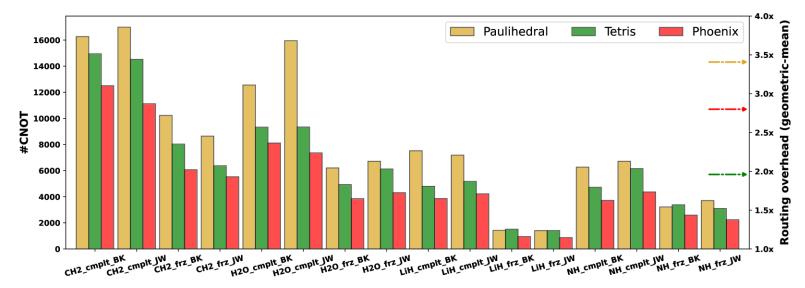


Assemble (order) simplified IRs subcircuits to exploit other opportunities, e.g., gate cancellation



### Evaluation: For topology-limited devices

- On the heavy-hex topology (IBM's Manhattan), Phoenix significantly outperforms other SOTAs
  - 36.17% (22.62%) #2Q and 43.85% (28.12%) Depth2Q reduction v.s. Paulihedral (Tetris)
- Qubit routing overhead (#2Q<sub>before-mapping</sub>/#2Q<sub>after-mapping</sub>)
  - Paulihedral (3.4x) > Phoenix (2.8x) > Tetris (1.9x)





#### **Evaluation: For alternative ISAs**

CNOT ISA is not unique in quantum computing! Three-CNOT SWAP-based routing is not unique as well!

- More and more continuous ISAs (gate sets) are adopted (e.g., IBM's fractional gates, IonQ's partial entangling gates)
- Again, Phoenix significantly outperforms other SOTAs in SU(4) ISA (arXiv:2312.05652)
  - The advantage of Phoenix in SU(4) ISA is more impressive than that in CNOT ISA
- We show that without deep co-optimization (e.g., CNOT unrolling, SWAP-based routing), the Phoenix optimization framework proves generic advantage!

	CNOT IS	SA (all-to-all)	SU(4) ISA (all-to-all)		CNOT ISA (heavy-hex)		SU(4) ISA (heavy-hex)	
PHOENIX's opt. rate	#CNOT	Depth-2Q	#SU(4)	Depth-2Q	#CNOT	Depth-2Q	#SU(4)	Depth-2Q
PHOENIX v.s. TKET	63.87%	64.0%	56.04%	54.22%	40.63%	48.32%	44.29%	50.71%
PHOENIX v.s. PAULIHEDRAL	82.12%	73.33%	75.57%	65.2%	62.38%	54.7%	39.84%	35.07%
PHOENIX v.s. TETRIS	57.52%	53.04%	56.54%	50.55%	75.97%	71.18%	62.23%	58.74%



# Alternative choices of Clifford group generators

	C(Z, X)	C(Z, Y)	C(Z, Z)	C(X, Y)	C(X, X)	C(Y, Y)
XX	XI	-YZ	YY	IX	XX	ZZ
XY	YZ	XI	-YX	XY	IY	XI
XZ	-YY	YX	XI	IZ	IZ	-ZX
YX	YI	XZ	-XY	-ZZ	YI	IX
YY	-XZ	YI	XX	YI	ZZ	YY
YZ	XY	-XX	YI	ZX	-ZY	IZ
ZX	ZX	IX	IX	YZ	ZI	-XZ
ZY	IY	ZY	IY	ZI	-YZ	ZI
ZZ	IZ	IZ	ZZ	-YX	YY	XX

	iSWAP(X, X)	iSWAP(X, Y)	iSWAP(X, Z)	iSWAP(Y, Y)	iSWAP(Y, Z)	iSWAP(Z, Z)
XX	XX	-ZI	-YI	XX	ZY	XX
XY	ZI	XY	-ZI	-IZ	XY	YX
XZ	-YI	-YI	XZ	ZX	-IX	IY
YX	IZ	YX	-ZY	-ZI	XI	XY
YY	YY	IZ	YY	YY	-ZI	YY
YZ	ZY	-ZX	IX	XI	YZ	-IX
ZX	-IY	-YZ	ZX	XZ	ZX	YI
ZY	YZ	IX	-YX	IX	XX	-XI
ZZ	ZZ	ZZ	IY	ZZ	IY	ZZ

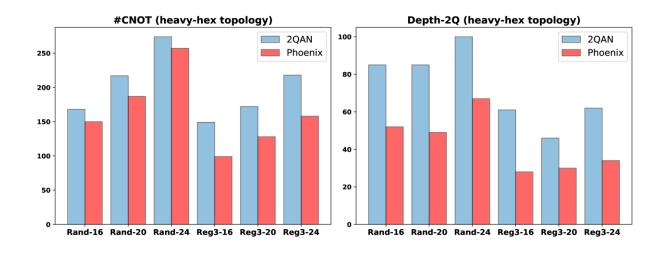
- Optimization effects based on iSWAP-equivalent Cliffords or CNOT-iSWAP-mixed Cliffords are comparable to our previous choice of "universal controlled gate" CNOT-equivalent Cliffords
- This provides hardware-friendly property for hardware with non-CNOT native gate sets

#### **Evaluation: UCCSD benchmarks info**

Benchmark	#Qubit	#Pauli	$\mathbf{w}_{ ext{max}}$	#Gate	#CNOT	Depth	Depth-2Q
CH2_cmplt_BK	14	1488	10	37780	19574	23568	19399
CH2_cmplt_JW	14	1488	14	34280	21072	23700	19749
CH2_frz_BK	12	828	10	19880	10228	12559	10174
CH2_frz_JW	12	828	12	17658	10344	11914	9706
H2O_cmplt_BK	14	1000	10	25238	13108	15797	12976
H2O_cmplt_JW	14	1000	14	23210	14360	16264	13576
H2O_frz_BK	12	640	10	15624	8004	9691	7934
H2O_frz_JW	12	640	12	13704	8064	9332	7613
LiH_cmplt_BK	12	640	10	16762	8680	10509	8637
LiH_cmplt_JW	12	640	12	13700	8064	9342	7616
LiH_frz_BK	10	144	9	2890	1442	1868	1438
LiH_frz_JW	10	144	10	2850	1616	1985	1576
NH_cmplt_BK	12	640	10	15624	8004	9691	7934
NH_cmplt_JW	12	640	12	13704	8064	9332	7613
NH_frz_BK	10	360	9	8303	4178	5214	4160
NH_frz_JW	10	360	10	7046	3896	4640	3674



### **Evaluation: QAOA benchmarking**



#### QAOA BENCHMARKING VERSUS 2QAN.

QAC	)A	#C	NOT	OT Depth-		#SWAP		Routing overhead	
Bench.	#Pauli	2QAN	Phoenix	2QAN	Phoenix	2QAN	Phoenix	2QAN	Phoenix
Rand-16	32	168	150	85	52	37	29	2.62x	2.34x
Rand-20	40	217	187	85	49	47	39	2.71x	2.34x
Rand-24	48	274	257	100	67	63	56	2.85x	2.68x
Reg3-16	24	149	99	61	28	44	17	3.10x	2.06x
Reg3-20	30	172	128	46	30	46	23	2.87x	2.13x
Reg3-24	36	218	158	62	34	62	30	3.03x	2.19x
Avg. improv16.7%		-40.8%		-29.41%		-16.59%			



# **Evaluation: Algorithmic error analysis**

- Algorithmic error (disparity between circuit and ideal evolution)
  - E.g., infid =  $1 \frac{1}{N} |\text{Tr}(U^{\dagger}V)|$

