

Quantum Homomorphic Encryption for Polynomial-Size Circuits

Christian Schaffner



Joint work with

Yfke Dulek and Florian Speelman

<http://arxiv.org/abs/1603.09717>



Institute for Logic, Language
and Computation (ILLC)

University of Amsterdam

QuSoft

Research Center for
Quantum Software



Centrum

Wiskunde & Informatica

Symposium on the Work of Ivan Damgård
Friday, 1 April 2016



Roadmap

- (Classical) Homomorphic Encryption
- Quantum Homomorphic Encryption
- Computation by teleportation
- Our scheme

Homomorphic encryption

Classical case

- Encrypt data so that another party can perform calculations on the encrypted data

- Many applications



CHILD



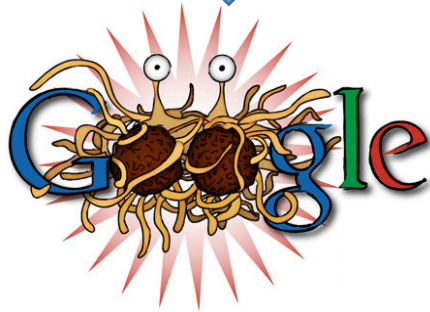
CAT



CHAIR

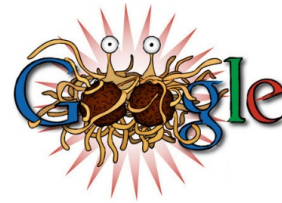
Tagging





CHILD	CAT	CHAIR
-------	-----	-------





RSA

Multiplicative homomorphic

- Public key: exponent e and modulus N
- Encryption of a message : $\text{Enc}(x) = x^e \bmod N$

Given encryptions of messages x and y
possible to compute the encryption of the product:

$$(x^e \bmod N)(y^e \bmod N) = (xy)^e \bmod N$$

$$\text{Enc}(x)\text{Enc}(y) = \text{Enc}(xy)$$

Fully Homomorphic Encryption

- Encrypt data so that another party can perform calculations on the encrypted data
- RSA (and ElGamal) are homomorphic with respect to multiplication
- Other schemes (e.g. Goldwasser-Micali) are additively homomorphic

$$\text{Enc}(x) \cdot \text{Enc}(y) = \text{Enc}(x \oplus y)$$

- Universal computation needs **both**

$$\text{ADD: } \text{ADD}(\text{Enc}(x), \text{Enc}(y)) = \text{Enc}(x + y)$$

$$\text{MULT: } \text{MULT}(\text{Enc}(x), \text{Enc}(y)) = \text{Enc}(xy)$$

while staying compact (complexity of Dec does not depend on evaluation circuit)

- First breakthrough proposal by Gentry 2009, currently multiple candidates

still slow: seconds per bit operation, but some of you know better than I do...

Roadmap

✓ (Classical) Homomorphic Encryption

■ Quantum Homomorphic Encryption

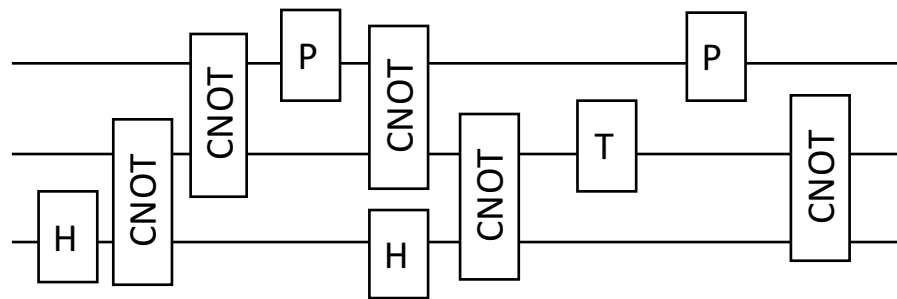
■ New ingredients – computation by teleportation

■ Our scheme

Quantum Homomorphic Encryption

- Encrypt *quantum state* instead of classical data
 $\rho \rightarrow \text{QEnc}(\rho)$

- Execute *quantum circuit* on encrypted data



Classical
Homomorphic
Encryption

+

Quantum
One-Time Pad

Quantum Homomorphic Encryption
for Clifford circuits

One-time pad

Plaintext n -bit string

$$x \in \{0,1\}^n$$

Key n -bit string

$$k \leftarrow \{0,1\}^n \leftarrow \text{randomly chosen}$$

Ciphertext $c = x \oplus k$

x	0	1	1	0	1
k	1	1	0	0	1
c	1	0	1	0	0

Properties:

Perfectly secure

Key same size as message – each key can be used only once

LFHMY ZAHBB JRNXX BYMFW KOZAT
 VRETH JPCBU RUSYQ JVKNN HLBEL
 PODYV JJLVJ XFSKL HPLGA ZXVZY
 TSUIO XBNKI HBSND HPNPI DZVQZ
 EYJFV DBXKR PRTVY YTK&K ATOPE
 NHCJK FPNBV BRZZN QQZYN CYSDE
 YIIUJ TARRZ QHRDE YOVRJ HOC6Y
 HALOK NHIIN CAIDV RDTKH ZDZMP
 OINDS CMQFE XEBVJ CAYSO I&BHU
 KLSZX OZJIM DBRCY BNUVZ LFBKT
 TTI WIFW IHNSF RUVVC UITRN
 NQONG ZUBZB EPVJI NCZXY FBTEX
 VEIOE HDVTN GSSNG LRZFG UKUQK
 POFRI QCFAA NLTKE D&NDA QAINU
 HEINQ LBTWP NYBNX MNUUK ACPKA
 ATGFS ZNFOD SYNXX IYIPD RJCEK
 PROPO JFBIQ NYLIX GVTNC Q&XXH
 F&GNA UDTLB UNKAN HARKG TZYXN
 UGBOA JXMFY HTUNH WCTXH QFLSY

A	ABCDEFGHIJKLMN OPQRSTUVWXYZ
B	ZYXWVUTSRQPONMLKJIHGFEDCBA
C	ABCDEFGHIJKLMN OPQRSTUVWXYZ
D	ZYXWVUTSRQPONMLKJIHGFEDCBA
E	ABCDEFGHIJKLMN OPQRSTUVWXYZ
F	ZYXWVUTSRQPONMLKJIHGFEDCBA
G	ABCDEFGHIJKLMN OPQRSTUVWXYZ
H	ZYXWVUTSRQPONMLKJIHGFEDCBA
I	ABCDEFGHIJKLMN OPQRSTUVWXYZ
J	ZYXWVUTSRQPONMLKJIHGFEDCBA
K	ABCDEFGHIJKLMN OPQRSTUVWXYZ
L	ZYXWVUTSRQPONMLKJIHGFEDCBA
M	ABCDEFGHIJKLMN OPQRSTUVWXYZ
N	ZYXWVUTSRQPONMLKJIHGFEDCBA
O	ABCDEFGHIJKLMN OPQRSTUVWXYZ
P	ZYXWVUTSRQPONMLKJIHGFEDCBA
Q	ABCDEFGHIJKLMN OPQRSTUVWXYZ
R	ZYXWVUTSRQPONMLKJIHGFEDCBA
S	ABCDEFGHIJKLMN OPQRSTUVWXYZ
T	ZYXWVUTSRQPONMLKJIHGFEDCBA
U	ABCDEFGHIJKLMN OPQRSTUVWXYZ
V	ZYXWVUTSRQPONMLKJIHGFEDCBA
W	ABCDEFGHIJKLMN OPQRSTUVWXYZ
X	ZYXWVUTSRQPONMLKJIHGFEDCBA
Y	ABCDEFGHIJKLMN OPQRSTUVWXYZ
Z	ZYXWVUTSRQPONMLKJIHGFEDCBA

One-time pad table (U.S. National Security Agency)

Quantum One-time Pad

- Pauli operators $X = \begin{pmatrix} 0 & 1 \\ 1 & 0 \end{pmatrix}$, $Y = \begin{pmatrix} 0 & -i \\ i & 0 \end{pmatrix}$, $Z = \begin{pmatrix} 1 & 0 \\ 0 & -1 \end{pmatrix}$
- Self-inverse: $X^2 = \mathbb{I} = \begin{pmatrix} 1 & 0 \\ 0 & 1 \end{pmatrix}$, $Y^2 = \mathbb{I}$, $Z^2 = \mathbb{I}$
- Anti-commute: $XZ = -ZX$, $XY = -YX$, $YZ = -ZY$



- Flip two random bits $a, b \leftarrow \{0,1\}$,
encryption of a qubit ρ : $X^a Z^b \rho X^a Z^b$
- Perfect security: not knowing a, b , density matrix becomes *fully mixed*:
 $\frac{1}{4} \sum_{a,b} X^a Z^b \rho Z^a X^b = \mathbb{I}/2$

Pauli Group on n Qubits

Pauli operators

$$X = \begin{pmatrix} 0 & 1 \\ 1 & 0 \end{pmatrix}, Y = \begin{pmatrix} 0 & -i \\ i & 0 \end{pmatrix}, Z = \begin{pmatrix} 1 & 0 \\ 0 & -1 \end{pmatrix}$$

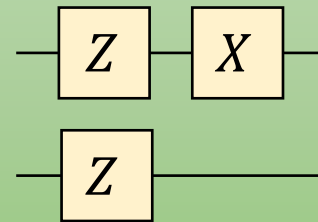


- Pauli group $P_n := \{\phi X^{\vec{a}} Z^{\vec{b}} : \vec{a}, \vec{b} \in \{0,1\}^n, \phi \in \{\pm i, \pm 1\}\}$

2-qubit example:

$$\vec{a} = 10, \vec{b} = 11$$

$$X^{\vec{a}} Z^{\vec{b}} =$$



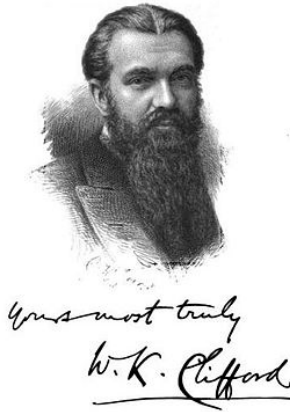
- Encryption of n qubits ρ : $X^{\vec{a}} Z^{\vec{b}} \rho X^{\vec{a}} Z^{\vec{b}}$ for random $\vec{a}, \vec{b} \in \{0,1\}^n$
- Perfect security: not knowing \vec{a}, \vec{b} , density matrix becomes *fully mixed*:

$$\frac{1}{4^n} \sum_{\vec{a}, \vec{b}} X^{\vec{a}} Z^{\vec{b}} \rho X^{\vec{a}} Z^{\vec{b}} = \mathbb{I}/2^n$$

The Clifford group

Pauli operators

$$X = \begin{pmatrix} 0 & 1 \\ 1 & 0 \end{pmatrix}, Y = \begin{pmatrix} 0 & -i \\ i & 0 \end{pmatrix}, Z = \begin{pmatrix} 1 & 0 \\ 0 & -1 \end{pmatrix}$$



- Clifford group is the *normalizer of the Pauli group*:

For all Cliffords C , for all Paulis $X^{\vec{a}}Z^{\vec{b}}$,

there exist $\vec{c}, \vec{d} \in \{0,1\}^n$ such that $CX^{\vec{a}}Z^{\vec{b}} = X^{\vec{c}}Z^{\vec{d}}C$

- Generated by $H = \frac{1}{\sqrt{2}} \begin{pmatrix} 1 & 1 \\ 1 & -1 \end{pmatrix}$, $P = \begin{pmatrix} 1 & 0 \\ 0 & i \end{pmatrix}$, $CNOT = \begin{pmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 0 & 1 \\ 0 & 0 & 1 & 0 \end{pmatrix}$

- Examples: $HX = ZH$, $PZ = ZP$, $PX = XZP$

- Not a universal gate set
 - Classical simulation possible

Example interaction with quantum one-time pad:

$$PX^aZ^b|\psi\rangle = X^aZ^{a\oplus b}P|\psi\rangle$$

Quantum Homomorphic Encryption

For Clifford circuits

Encryption (of single qubit):

Input state: $|\psi\rangle$

Flip random classical bits a, b

Output: $X^a Z^b |\psi\rangle, \text{Enc}(a), \text{Enc}(b)$

Circuit Evaluation:

Apply Clifford gate to quantum part

Homomorphically update classical keys according to commutation relations

Classical homomorphic scheme:

Encryption: $c = \text{Enc}(x)$

Decryption: $x = \text{Dec}(c)$

Example: evaluation of P gate:

- $PX^a Z^b |\psi\rangle = X^a Z^{a \oplus b} P |\psi\rangle$
- homomorphic update
 $\text{Enc}(b') \leftarrow \text{ADD}(\text{Enc}(a), \text{Enc}(b))$

State maintains form:

$X^{a'} Z^{b'} |\psi'\rangle, \text{Enc}(a'), \text{Enc}(b')$

Extending the gate set: T gate

T gate (also known as $\frac{\pi}{8}$ or R gate) is given by $T = \begin{pmatrix} 1 & 0 \\ 0 & e^{i\pi/4} \end{pmatrix}$

Clifford+T can approximate all quantum operations (universal set)

Trouble: Applying T gate on a one-time-pad encrypted state results in

ciphertext: $TX^aZ^b|\psi\rangle = P^aX^aZ^bT|\psi\rangle, Enc(a), Enc(b)$

because $TZ = ZT, TX = PXT$ (not Clifford!)

Who can remove this extra P-gate?

Evaluator only has **encrypted version of a and b** , while the encrypting party knows the key


Previous Work: Overview

	homomorphic for	compactness	security
Not encrypting	Quantum circuits	yes	no
append evaluation description	Quantum circuits	Complexity of Dec prop to (# gates)	yes
Quantum OTP	no	yes	inf theoretic
Clifford Scheme	Clifford circuits	yes	computational
[BJ15]: AUX	Q circuits with constant T-depth	yes	computational
[BJ15]: EPR	Quantum circuits	Complexity of Dec prop to (#T-gates) ²	computational
Our result	Quantum circuits of polynomial size (levelled fully homomorphic)	yes	computational

[BJ15] A. Broadbent, S. Jeffery. Quantum Homomorphic Encryption for Circuits of Low T-gate Complexity. CRYPTO 2015
 (comparison based on Stacey Jeffery's slides)

Related Work

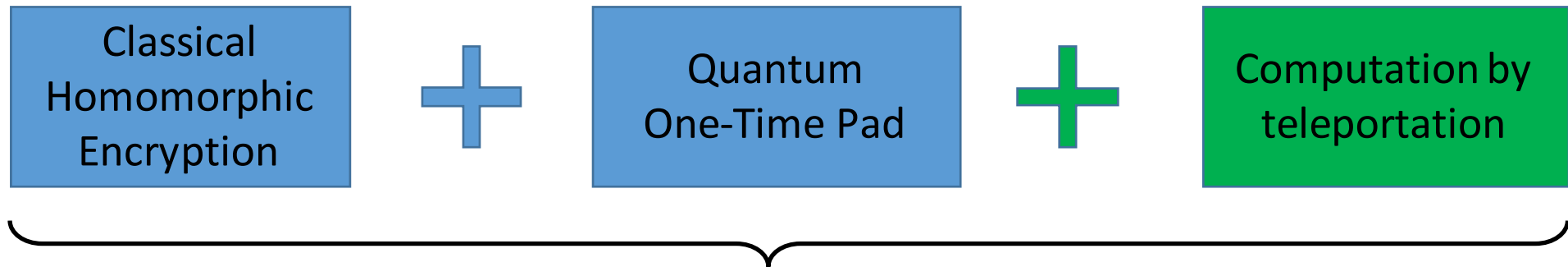
- Secure delegated quantum computing
 - Childs 2005; Broadbent, Fitzsimons, Kashefi 2009; Aharonov, Ben-Or, Eban 2010; Broadbent 2015
- Secure 2-party quantum computation
 - Dupuis, Nielsen, Salvail 2010; Dupuis, Nielsen, Salvail 2010
- Perfectly secure quantum FHE not possible with information-theoretic security
 - Yu, Perez-Delgado, Fitzsimons 2014
- Quantum homomorphic encryption with information leakage (not IND secure)
 - Tan, Kettlewell, Ouyang, Chen, Fitzsimons 2014



require
interaction
between
encryptor and
evaluator

Roadmap

- ✓ (Classical) Homomorphic Encryption
- ✓ Quantum Homomorphic Encryption
- Computation by Teleportation
- Our scheme



Quantum homomorphic encryption
for polynomial-sized circuits

[GC99] Daniel Gottesman and Isaac L. Chuang. Quantum Teleportation is a Universal Computational Primitive. *Nature* '99

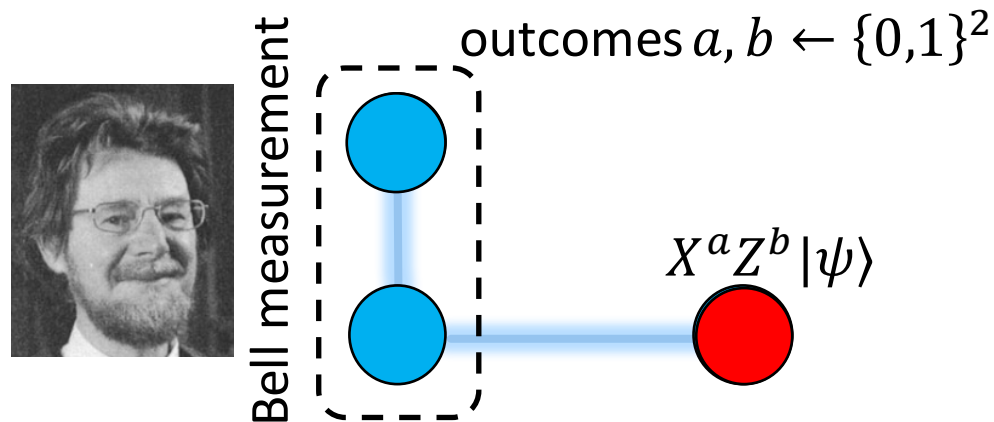
Entanglement and Quantum Teleportation

- Entanglement

EPR pair: $\frac{1}{\sqrt{2}} |00\rangle + \frac{1}{\sqrt{2}} |11\rangle$, state can not be written as two separate qubits



- Teleportation transfers a quantum bit using an EPR pair and two classical bits



Teleportation of Clifford gates

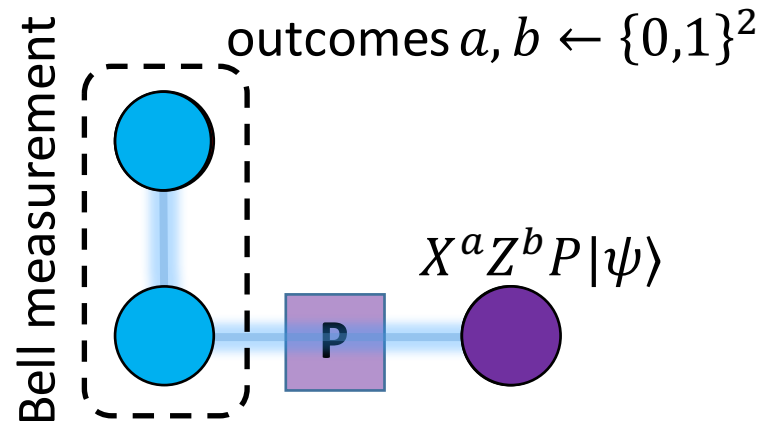
$$P = \begin{pmatrix} 1 & 0 \\ 0 & i \end{pmatrix}$$

- Start with modified EPR pair:

$$\frac{1}{\sqrt{2}} |00\rangle + i \frac{1}{\sqrt{2}} |11\rangle$$



- Teleportation:

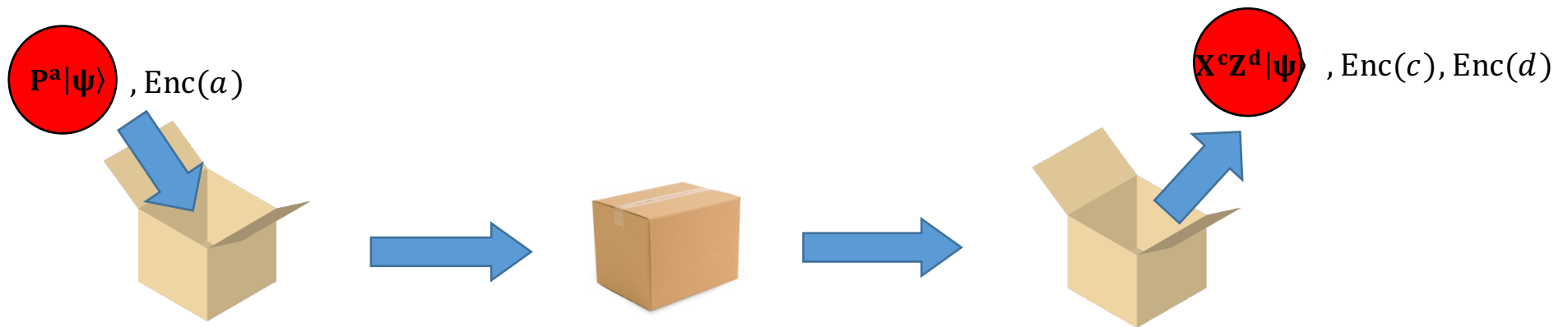


Creating a T-gate gadget

$$\begin{aligned} & TX^a Z^b |\psi\rangle \\ &= P^a X^a Z^b T |\psi\rangle, \text{Enc}(a), \text{Enc}(b) \end{aligned}$$

Who can remove this extra P-gate?

Evaluator only has encrypted version of a, b ,
while encrypting party knows the key



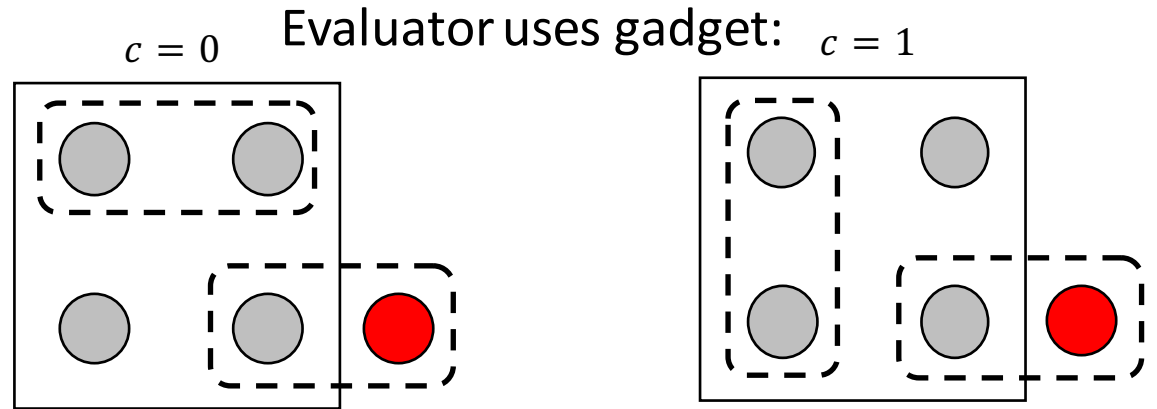
Depending on a ,
a phase gate is applied

Toy example of gadget

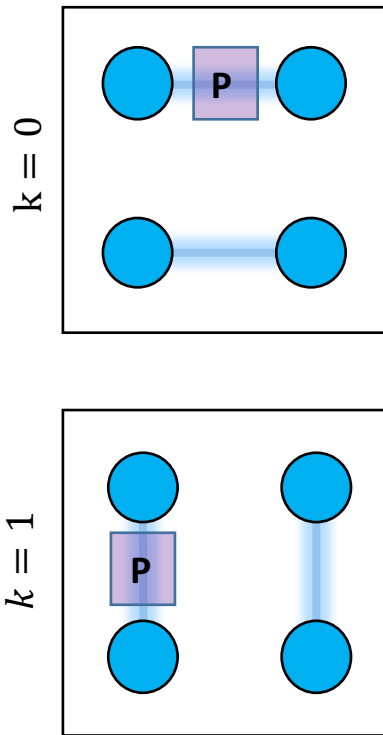
Encrypting party has: $k \in \{0,1\}$

Evaluator has: $c = \text{Enc}(a) = a \oplus k \in \{0,1\}$

Want to apply a phase gate if $c \oplus k = a = 1$



Encryptor prepares gadget:



Toy example of gadget

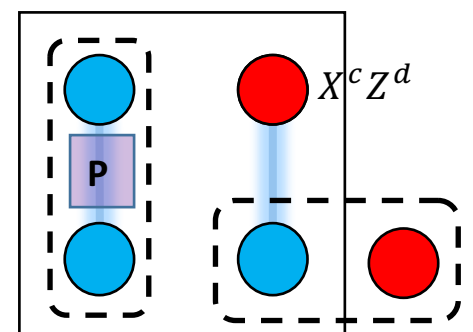
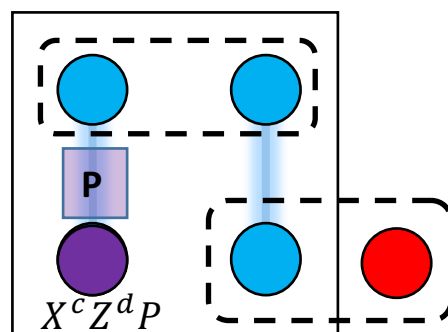
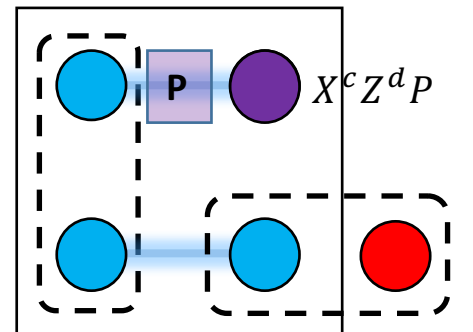
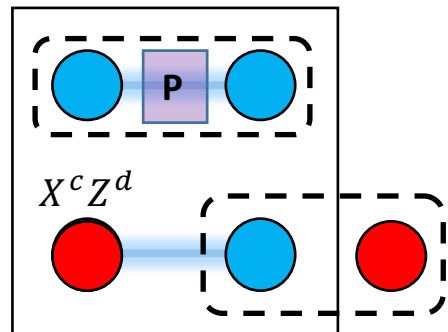
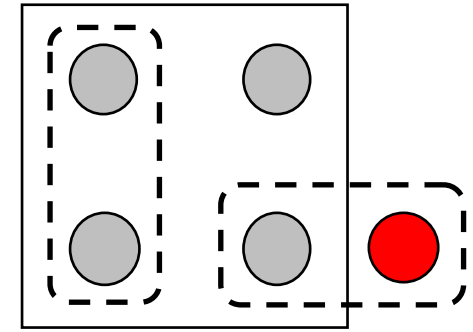
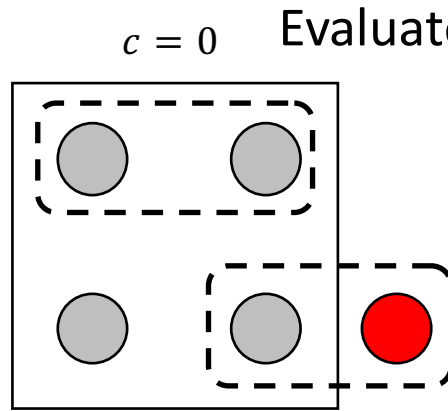
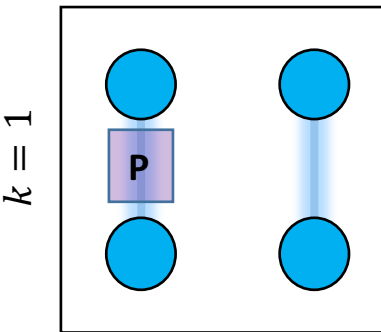
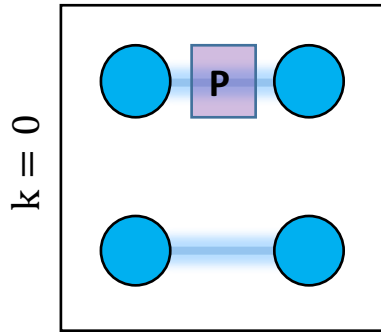
Encrypting party has: $k \in \{0,1\}$

Evaluator has: $c = \text{Enc}(a) = a \oplus k \in \{0,1\}$

Want to apply a phase gate if $c \oplus k = a = 1$

Using a fixed Bell state is insecure, but choice of Bell state can be randomized

Encryptor prepares gadget:



Construction of T-gate gadget

- Using **Barrington's theorem**, we can construct gadgets for decryption functions computable in poly-sized log-depth circuits.
- Using techniques from the **garden-hose model**, we can create gadgets for any decryption function computable in log-space.
- Fortunately for us: all known classical homomorphic encryption schemes have a decryption function computable in log-space

Homomorphic decryption

Most current schemes are based on *Learning With Errors (LWE)*

Brakerski-Vaikuntanathan (2011):

Key: $\mathbf{s} \in \mathbb{Z}_p^k$ (vector of length k over \mathbb{Z}_p)

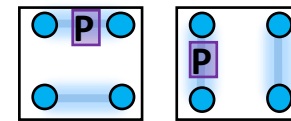
Ciphertext: $(\mathbf{v}, w) \in \mathbb{Z}_p^k \times \mathbb{Z}_p$

Decryption: $m = w - \sum_{i=1}^k s_i v_i \pmod{p} \pmod{2}$

Putting the scheme together

- **Encryption:**

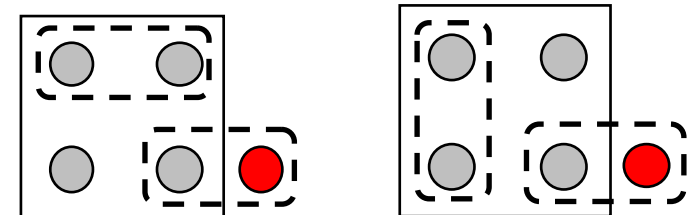
- Encrypt qubits using Quantum One-Time Pad
- Use classical HE to encrypt the key to the one-time pad
- *Create extra helper-gadgets from private key:*



- **Evaluation:**

- Clifford gates: execute and update keys
- *T gates: execute and use gadget to correct the state*

measurement choices are given by classical encrypted information

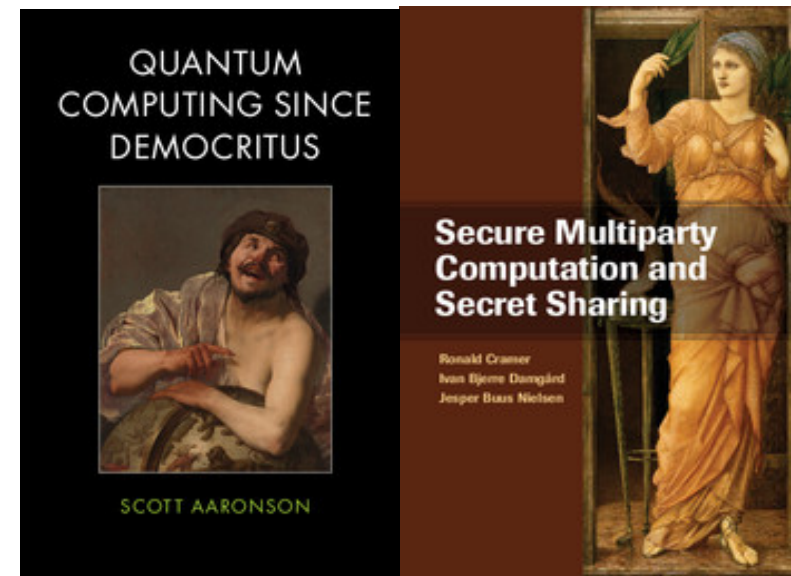


Summary

- Scheme for quantum homomorphic encryption
 - Single quantum gadget for every T gate
 - Polynomial-size for all current classical homomorphic schemes
 - We require the computational assumptions of classical scheme
- Main ingredients:
 - Classical homomorphic encryption
 - Quantum one-time pad
 - EPR gadgets (depending on secret key) to *conditionally* remove errors

Open questions / Future work

- Quantum Fully Homomorphic Encryption
 - Currently: helper gadgets required for evaluation of each T gate
- Other cryptographic primitives
 - (round-efficient) delegated quantum computation
 - Quantum Multi-Party Computation
 - Quantum circuit obfuscation
 - ...?



Thank you for your attention!

Questions



QuSoft



Barrington's Theorem [1989]

NC^1

Boolean circuits with

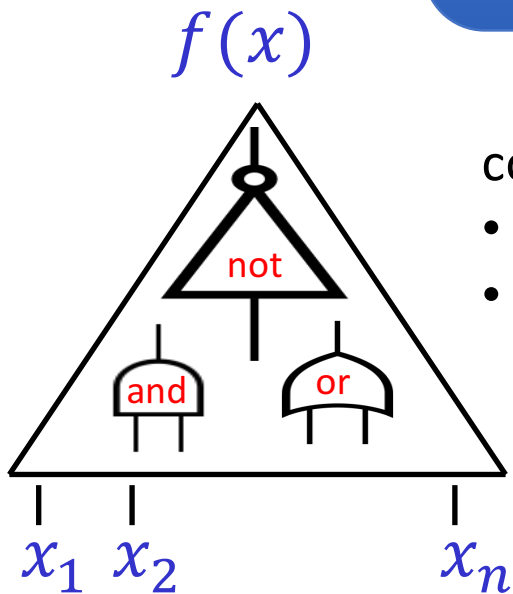
- Fan-in 2 gates
- Polynomial size
- Depth is $\log(n)$

=

Width-5 PBP

Branching Programs

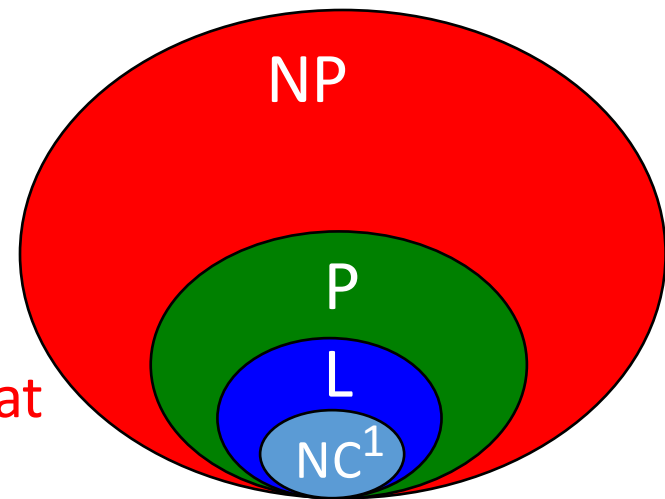
- Polynomial size
- Permutations from S_5



contains many non-trivial functions:

- Majority, Parity, Equality
- Decryption of common FHE schemes

No proof that
 $NP \neq NC^1$



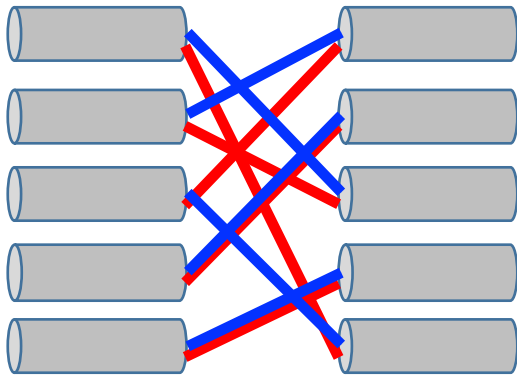
Width-5 Permutation Branching Programs

function: $f: \{0,1\}^3 \rightarrow \{0,1\}$ input: $x_1 x_2 x_3$ (this example: $n = 3$)

instructions: $(\sigma_1^0, \sigma_1^1), (\sigma_2^0, \sigma_2^1), (\sigma_3^0, \sigma_3^1), (\sigma_4^0, \sigma_4^1), \dots, (\sigma_k^0, \sigma_k^1)$ $\sigma_j^i \in S_5$

$x_1 = 0$

$x_1 = 1$

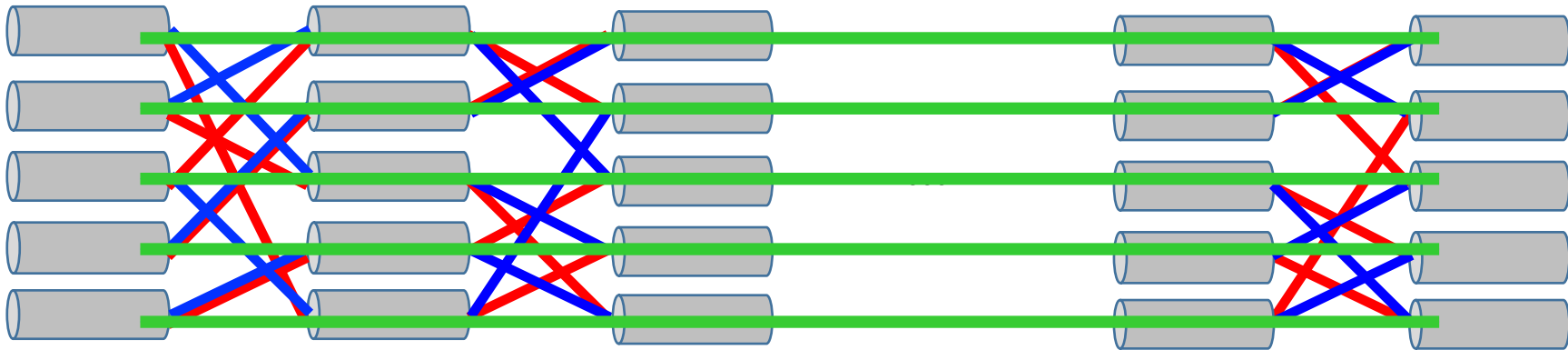


Width-5 Permutation Branching Programs

function: $f: \{0,1\}^3 \rightarrow \{0,1\}$ input: $x_1 x_2 x_3$ (this example: $n = 3$)

instructions: $(\sigma_1^0, \sigma_1^1), (\sigma_2^0, \sigma_2^1), (\sigma_3^0, \sigma_3^1), (\sigma_4^0, \sigma_4^1), \dots, (\sigma_k^0, \sigma_k^1)$

$x_1 = 0$ $x_2 = 0$ $x_3 = 0$ $x_1 = 0$
 $x_1 = 1$ $x_2 = 1$ $x_3 = 1$ $x_1 = 1$...



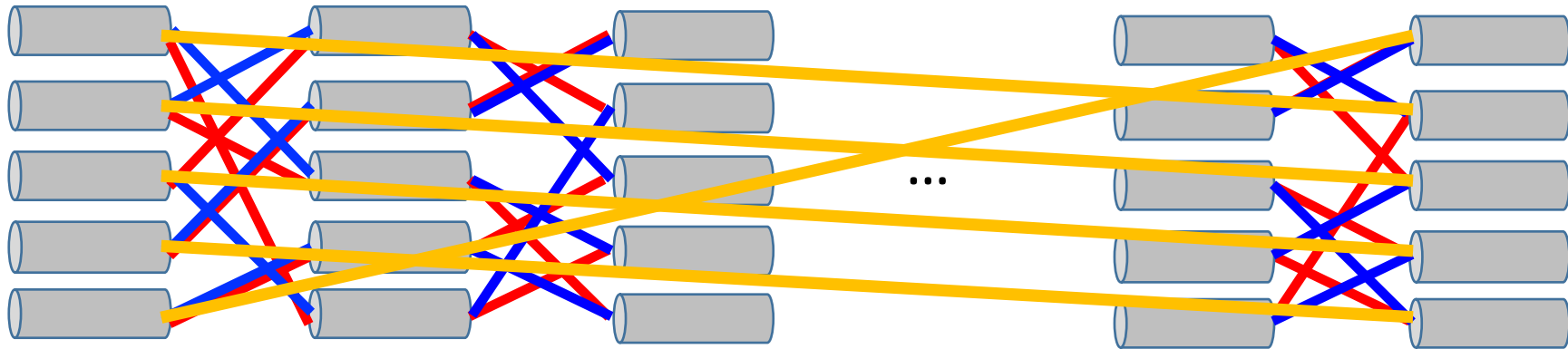
$$\sigma_1^{x_1} \cdot \sigma_2^{x_2} \cdot \sigma_3^{x_3} \cdot \sigma_4^{x_1} \cdots \sigma_k^{x_{k \bmod 3}} = \begin{cases} id & \text{if } f(x_1 x_2 x_3) = 1 \\ \pi & \text{if } f(x_1 x_2 x_3) = 0 \end{cases}$$

Width-5 Permutation Branching Programs

function: $f: \{0,1\}^3 \rightarrow \{0,1\}$ input: $x_1 x_2 x_3$ (this example: $n = 3$)

instructions: $(\sigma_1^0, \sigma_1^1), (\sigma_2^0, \sigma_2^1), (\sigma_3^0, \sigma_3^1), (\sigma_4^0, \sigma_4^1), \dots, (\sigma_k^0, \sigma_k^1)$

$x_1 = 0$ $x_2 = 0$ $x_3 = 0$ $x_1 = 0$
 $x_1 = 1$ $x_2 = 1$ $x_3 = 1$ $x_1 = 1$...



$$\sigma_1^{x_1} \cdot \sigma_2^{x_2} \cdot \sigma_3^{x_3} \cdot \sigma_4^{x_1} \dots \sigma_k^{x_{k \bmod 3}} = \begin{cases} id & \text{if } f(x_1 x_2 x_3) = 1 \\ \pi & \text{if } f(x_1 x_2 x_3) = 0 \end{cases}$$

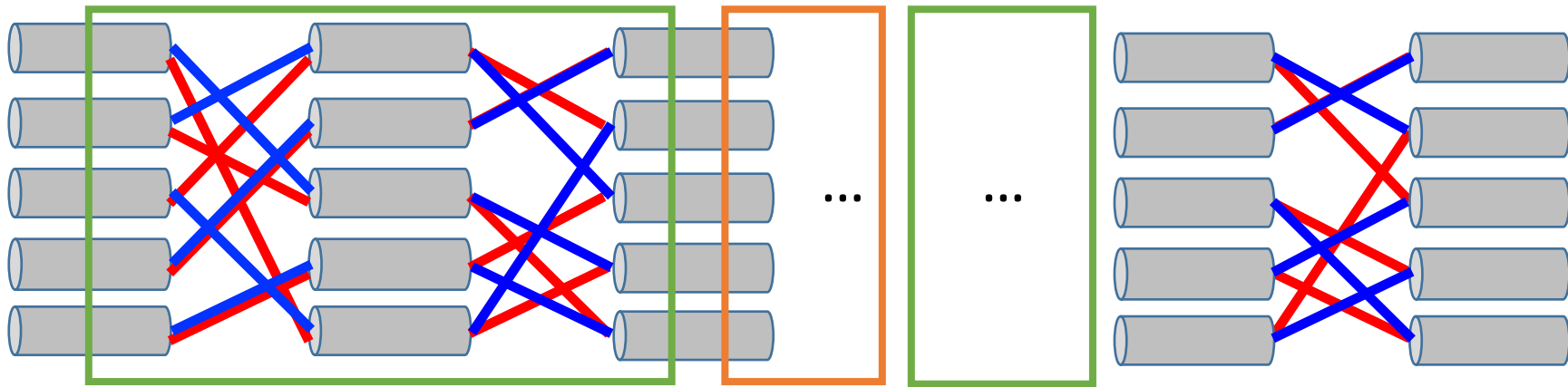
$\pi \in S_5$ a fixed 5-cycle

From Perm Branching Programs to Quantum Gadgets

function: $Dec()$ input: $sk, Enc(a)$

instructions: $(\sigma_1^0, \sigma_1^1), (\sigma_2^0, \sigma_2^1), (\sigma_3^0, \sigma_3^1), (\sigma_4^0, \sigma_4^1), \dots, (\sigma_k^0, \sigma_k^1)$

encryptor
evaluator

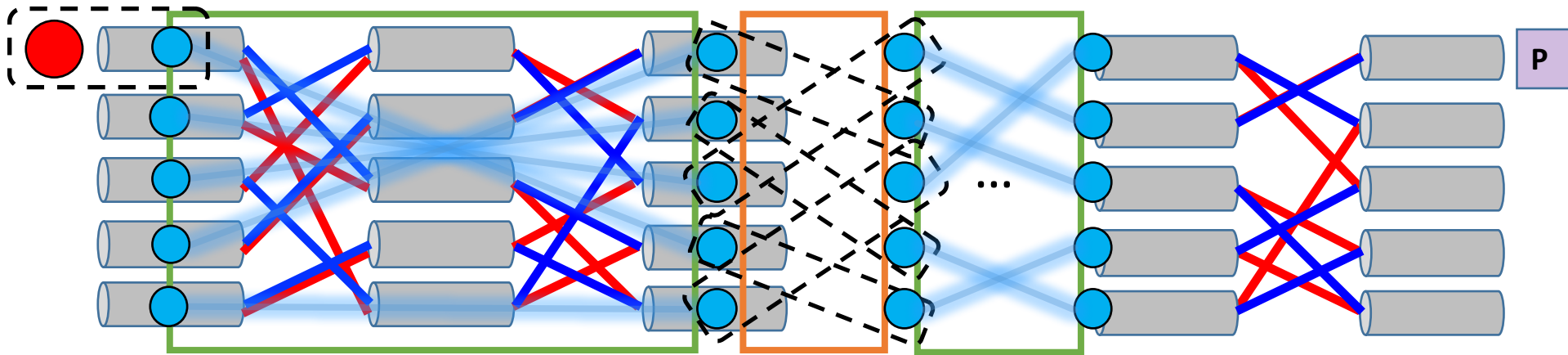


$$\sigma_1^{x_1} \cdot \sigma_2^{x_2} \cdot \sigma_3^{x_3} \cdot \sigma_4^{x_1} \cdot \dots \cdot \sigma_k^{x_k} = \begin{cases} id & \text{if } Dec(sk, Enc(a)) = 1 \\ \pi & \text{if } Dec(sk, Enc(a)) = 0 \end{cases}$$

From Perm Branching Programs to Quantum Gadgets

function: $Dec()$ input: $sk, Enc(a)$

instructions: $(\sigma_1^0, \sigma_1^1), (\sigma_2^0, \sigma_2^1), (\sigma_3^0, \sigma_3^1), (\sigma_4^0, \sigma_4^1), \dots, (\sigma_k^0, \sigma_k^1)$
encryptor evaluator



$$\sigma_1^{x_1} \cdot \sigma_2^{x_2} \cdot \sigma_3^{x_3} \cdot \sigma_4^{x_1} \cdot \dots \cdot \sigma_k^{x_k} = \begin{cases} id & \text{if } Dec(sk, Enc(a)) = 1 \\ \pi & \text{if } Dec(sk, Enc(a)) = 0 \end{cases}$$

- Finally, run all instructions in reverse to get the qubit to a known location