

#### **Programming Abstractions for Quantum Computing**

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#### Identify abstractions for solutions to quantum computing problems.

☑ New, different, unintuitive computing environment

Abstractions could speed up development of useful algorithms and optimizations

✓ Influence state-of-the-art systems

#### Quantum Computing 101

#### Qubits





#### Qubits













#### Measurement



#### Measurement



#### Entanglement



#### Entanglement



#### **Unitary Matrices**



In linear algebra, a complex square matrix U is **unitary** if its conjugate transpose  $U^*$  is also its inverse, that is, if

$$U^*U = UU^* = I,$$

where I is the identity matrix.

#### Unitary Operations: NOT=X=(<sup>01</sup><sub>10</sub>)

# Unitary Operations: NOT=X=( $^{01}_{10}$ )





#### Hadamard = $\frac{1}{\sqrt{2}} \left( \frac{1}{1} - 1 \right)$



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#### Physics

→ No-cloning
→ Reversible
→ Superposition
→ Measurement

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Superposition
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Computing Technology

→ Circuit model
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**PL** Theory

→ Data structures
→ Control flow

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**PL** Theory

**Semantics** 

Data structures
 Quantum CPOs
 Control flow
 String diagrams

#### Physics Abstraction No-Cloning





#### Yes duplication:

#### **QPL:** Substructural types

QPL Terms
$$P, Q$$
::=new bit  $b := 0$ new qbit  $q := 0$ discard  $x$  $b := 0$  $b := 1$  $q_1, \dots, q_n *= S$ skip $P; Q$ if  $b$  then  $P$  else  $Q$ measure  $q$  then  $P$  else  $Q$ while  $b$  do  $P$ proc  $X : \Gamma \to \Gamma' \{ P \}$  in  $Q \mid y_1, \dots, y_m = X(x_1, \dots, x_n)$ 

 $\Pi \vdash \langle \Gamma \rangle \text{ new qbit } q := \mathbf{0} \langle q : \mathbf{qbit}, \Gamma \rangle$ 

$$\Pi \vdash \langle x : t, \Gamma \rangle \text{ discard } x \langle \Gamma \rangle$$

Towards a Quantum Programming Language. Selinger, 2004

#### Quantum $\lambda$ calculus

 $\begin{array}{lll} M,N,P & ::= & c \mid x \mid \lambda x.M \mid MN \mid \\ & & \langle M,N \rangle \mid * \mid let \; \langle x,y \rangle = M \; in \; N \mid \\ & & inj_l(M) \mid \; inj_r(M) \mid match \; P \; with \; (x \mapsto M \mid y \mapsto N) \mid \\ & & let \; rec \; f \; x = M \; in \; N. \end{array}$ 

$$c ::= \text{new} : () \multimap \text{qubit}$$
$$| \text{ meas} : \text{qubit} \multimap \text{bit}$$
$$| U : \text{qubit}^{\otimes n} \multimap \text{qubit}^{\otimes n}$$

Quantum Lambda Calculus. Selinger and Valiron, 2009

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The Bell experiment can be viewed as the composition

$$\top \xrightarrow{\mathbf{EPR}} qbit \otimes qbit \xrightarrow{f' \otimes f'} (trit \to bit) \otimes (trit \to bit),$$

which produces a term of type  $(trit \rightarrow bit) \otimes (trit \rightarrow bit)$ , i.e., a pair  $\langle f, g \rangle$  of entangled functions.

Quantum Lambda Calculus. Selinger and Valiron, 2009

#### Quipper: Circuit generation

mycirc :: Qubit -> Qubit -> Circ (Qubit, Qubit) mycirc a b = doΗ a <- hadamard a b <- hadamard b Η (a,b) <- controlled\_not a b return (a,b)

### Haskell

Quipper: A Scalable Quantum Programming Language. Green, Lundsdane, Ross, Selinger, and Valiron, 2013

#### **Dependent Types**

Or

## Control Flow ?

PL Abstraction Dependent Types

#### Quantum Data Types

Quipper: A Scalable Quantum Programming Language. Green, Lundsdane, Ross, Selinger, and Valiron, 2013

#### Quantum Data Types

• Qubits, finite tuples of qubits

Quipper: A Scalable Quantum Programming Language. Green, Lundsdane, Ross, Selinger, and Valiron, 2013
# Quantum Data Types

- Qubits, finite tuples of qubits
- Lists of qubits
  - Introduced in Quipper
  - Present in most mainstream languages

Quipper: A Scalable Quantum Programming Language. Green, Lundsdane, Ross, Selinger, and Valiron, 2013

# Quantum Data Types

- Qubits, finite tuples of qubits
- Lists of qubits
  - Introduced in Quipper
  - Present in most mainstream languages
- Polymorphic lists, trees, algebraic data types

Quipper: A Scalable Quantum Programming Language. Green, Lundsdane, Ross, Selinger, and Valiron, 2013



Inductive Box w1 w2 : Set := ...

Definition hadamard\_measure : Box Qubit Bit :=
 box\_ q ⇒ meas \$ \_H \$ q.

QWIRE: A Core Language for Quantum Circuits. Paykin, Rand, Zdancewic, 2017

Fixpoint NTensor (n : nat) (W : WType) :=
 match n with
 | 0 => One
 | S n' => W ⊗ NTensor n' W
 end.
Infix "⊗" := NTensor (at level 30) : circ\_scope.

Fixpoint inParMany (n : nat) {W W'} (c : Box W W') : Box (n ⊗ W) (n ⊗ W') :=
 match n with
 | 0 => id\_circ
 | S n' => inPar c (inParMany n' c)
 end.

https://github.com/inQWIRE/QWIRE

### Shape-Dependent Quantum Types

```
-- length :: List Unit -o Nat
--
-- x : Shape(List Qubit) |- Vec Qubit (length x) : Type
toVec :: ! (x :: List Qubit) -o Vec Qubit (length x)
toVec x = case x of
        Nil -> VNil
        Cons y zs -> VCons y (g' zs)
```

### QQTT? (Quantum Quantitative Type Theory)

```
withAncilla : (Qubit -> List Qubit -> Qubit ⊗ List Qubit ->
List Qubit -> List Qubit
withAncilla f ls = let (q,ls') ← f (new 0) ls in
-- should be the case that q=|0)
let _ ← discard q in
ls'
```

### QQTT? (Quantum Quantitative Type Theory)

```
data Is0 (q : Qubit) : Type where
Is0 : Is0 (init 0)
withAncilla : ( (q : Qubit) ⊗ Is0 q -> List Qubit ->
        (q': Qubit) ⊗ Is0 q' ⊗ ∎ist Qubit ) ->
        List Qubit -> List Qubit
withAncilla f ls = let (q',pf,ls') = f (init 0,Is0,ls) in
        -- discard : (q : Qubit) -> Is0 q -> ()
        let _ ← discard q' pf in
        ls'
```

### Equality??

Algebraic Effects, Linearity, and Quantum Programming Languages. Staton 2015. A HoTT Quantum Equational Theory. Paykin and Zdancewic, 2019.

### Equality??

(U-⊗-intro)		
(U-⊗-elim) (U-⊗-comm)	$U # (V # e) \approx (U \circ V) # e$ $I # e \approx e$	(U-COMPOSE) (U-I)
(U-⊕-intro <sub>1</sub> )	$U^{\dagger}$ # $U$ # $e \approx e$	(U-†)
(U-⊕-INTRO <sub>2</sub> )		
(U-⊕-ELIM)		
(U-⊕-сомм)		
(U-LOWER-COMM)		
(U-LOWER-ELIM)		
	$(U-\otimes-INTRO)$ $(U-\otimes-ELIM)$ $(U-\otimes-COMM)$ $(U-\oplus-INTRO_1)$ $(U-\oplus-INTRO_2)$ $(U-\oplus-ELIM)$ $(U-\oplus-COMM)$ (U-LOWER-COMM) (U-LOWER-ELIM)	(U- $\otimes$ -INTRO) (U- $\otimes$ -ELIM) (U- $\otimes$ -COMM) $U \# (V \# e) \approx (U \circ V) \# e$ $I \# e \approx e$ (U- $\oplus$ -INTRO <sub>1</sub> ) (U- $\oplus$ -INTRO <sub>2</sub> ) (U- $\oplus$ -ELIM) (U- $\oplus$ -COMM) (U-LOWER-COMM) (U-LOWER-ELIM)

Algebraic Effects, Linearity, and Quantum Programming Languages. Staton 2015. A HoTT Quantum Equational Theory. Paykin and Zdancewic, 2019.

### Equality??

$$\begin{array}{ll} X \ \# \ \mbox{init} \ b \approx \ \mbox{init} (\neg b) & (X\ \mbox{INTRO}) \\ \mbox{let} \ !x := \mbox{meas}(X \ \# \ e) \ \mbox{in} \ e' \approx \ \mbox{let} \ !y := \mbox{meas} \ e \ \mbox{in} \ e' \{\neg y/x\} & (X\ \mbox{ELIM}) \end{array}$$

SWAP # 
$$(e_1, e_2) \approx (e_2, e_1)$$
 (SWAP-INTRO)

$$let (x, y) := SWAP \# e \text{ in } e' \approx let (y, x) := e \text{ in } e'$$
(SWAP-ELIM)

$$\texttt{DISTR} \# (\texttt{init} b, e) \approx \texttt{if} b \texttt{then} \iota_2 e \texttt{else} \iota_1 e \qquad (\texttt{DISTR-INTRO})$$
$$\texttt{case}(\texttt{DISTR} \# e) \texttt{of} (\iota_1 z_1 \to e_1 \mid \iota_2 z_2 \to e_2) \approx \texttt{let} (!b, y) \coloneqq e \texttt{in} (\texttt{init} b, e) \qquad (\texttt{DISTR-ELIM})$$

Algebraic Effects, Linearity, and Quantum Programming Languages. Staton 2015. A HoTT Quantum Equational Theory. Paykin and Zdancewic, 2019.

- Higher Inductive Types (HITs) use paths to encode equivalence relations or groupoids
  - Groupoid: category where all morphisms are invertible

$$f: G(\alpha, \beta)$$
$$[f]: [\alpha] = [\beta]$$

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A HoTT Quantum Equational Theory. Paykin and Zdancewic, 2019.

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  - Simplify proofs about groupoids
- Unitaries form a groupoid

A HoTT Quantum Equational Theory. Paykin and Zdancewic, 2019.

 $f: G(\alpha, \beta)$ 

 $[\mathbf{f}] : [\alpha] = [\beta]$ 

• UMatrix( $\alpha, \beta$ ): unitary matrices of dimension  $|\alpha| \times |\beta|$ .

- $\alpha, \beta$  : FinType are finite types
- Because unitaries are square,  $|\alpha| = |\beta|$ .
- Quantum types: QType = FinType/UMatrix.
  - Qubit = [Bool]<sub>UMatrix</sub>
- Unitaries are paths:

$$\frac{U: \mathsf{UMatrix}(\alpha, \beta)}{[U]: [\alpha] = [\beta]}$$

•  $H = \begin{pmatrix} \frac{1}{\sqrt{2}} & \frac{1}{\sqrt{2}} \\ \frac{1}{\sqrt{2}} & \frac{-1}{\sqrt{2}} \end{pmatrix}$ ,  $X = \begin{pmatrix} 0 & 1 \\ 1 & 0 \end{pmatrix}$ • [H] : Qubit = Qubit, [X] : Qubit = Qubit•  $[H] \neq [X] \neq 1_{\text{Qubit}}$ 

#### Theorem

Let U be a unitary transformation  $U: \sigma = \tau$ .  $(\sigma, \tau : QType \equiv FinType/UMatrix)$ 

If  $e: QExp \sigma$ , there exists  $U \# e: QExp \tau$ . (apply the unitary U to e)

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### Proof.

By path induction. Base case for  $1_{\sigma} : \sigma = \sigma$ :

$$1_{\sigma} \# e \equiv e$$

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#### Note

 $[H] \# e \neq e \ because \ [H] \neq 1_{Qubit}$ 

### Theorem

Let  $U: \sigma = \tau$  and  $V: \tau = \rho$  be unitaries. Then

$$V \# (U \# e) = (V \circ U) \# e.$$

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$$V \# (U \# e) = (V \circ U) \# e.$$

### Proof.

By path induction on V. If  $V \equiv 1_{\tau}$  then

$$LHS = 1_{\tau} \# (U \# e) = U \# e$$
$$RHS = (1_{\tau} \circ U) \# e = U \# e$$

### Theorem

$$[SWAP] \# (e_1, e_2) = (e_2, e_1)$$

Proof.	
????	

Structural equivalence  $\sigma \iff \tau$ :

$$swap_{X,Y}: X \times Y \to Y \times X$$
  
$$swap_{X,Y}(x,y) = (y,x)$$

Lift structural equivalence to unitary:

$$\widehat{\mathsf{swap}}_{\sigma,\tau}: \sigma \otimes \tau = \tau \otimes \sigma$$

such that

$$\widehat{\mathsf{swap}}_{\sigma,\tau} = [\mathsf{SWAP}_{\sigma,\tau}]$$

### Axiom

Let  $f: \sigma \iff \tau$  be a structural equivalence. Then

$$\widehat{f} \# \textit{init}_{\sigma}(b) \approx \textit{init}_{\tau}(f(b))$$

Partial initialization:

$$\widehat{\operatorname{swap}_{X,Y}} \# (e_1, e_2) \approx \operatorname{swap}(e_1, e_2) = (e_2, e_1)$$

### Axiom

Let  $f: \sigma \iff \tau$  be a structural equivalence. Then

$$\widehat{f} \# \textit{init}_{\sigma}(b) \approx \textit{init}_{\tau}(f(b))$$

### Axiom

Let  $f: \sigma \iff \tau$ . Then:

match 
$$\hat{f} \# e$$
 with  $g \approx$  match  $e$  with  $(g \circ f)$ 

- Quantum λ calculus = deep embedding in HoTT (univalence + groupoid quotients)
  - Would axioms be better in Cubical TT?

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- Quantitative HoTT?
- Quantum  $\lambda$  calculus = shallow embedding in QHoTT?

### Technology Abstraction Classical Communication
















Knill, 1996



Knill, 1996



Knill, 1996



Knill, 1996



PL Abstraction Control Flow

# Yes classical control

if meas()=1 then ... else ...

# Yes classical control



#### No\* quantum control



#### Controlled-NOT





#### **Controlled-U**





## Quantum unitary control





# Quantum if, take 1

$$qnot: \mathbf{Q_2} \multimap \mathbf{Q_2}$$

$$qnot x = \mathbf{if}^{\circ} x$$

$$\mathbf{then} \text{ qfalse}$$

$$\mathbf{else} \text{ qtrue}$$

$$cnot: \mathbf{Q_2} \multimap \mathbf{Q_2} \multimap \mathbf{Q_2} \otimes \mathbf{Q_2}$$

$$cnot \ c \ x = \mathbf{if}^{\circ} \ c$$

$$\mathbf{then} (\text{ qtrue}, qnot \ x)$$

$$\mathbf{else} (\text{ qfalse}, \ x)$$

$$had \in \mathcal{Q_2} \multimap \mathcal{Q_2}$$

had 
$$x = \mathbf{if}^{\circ} x$$
 then  $\{(-1) \text{ qtrue } | \text{ qfalse}\}$   
else  $\{\text{qtrue } | \text{ qfalse}\}$ 

QML: Quantum data and control. Altenkirch and Grattage, 2005

# Quantum if, take q

$$\begin{array}{c} \Gamma \vdash^{a} c : \sigma \oplus \tau \\ \Delta, \ x : \sigma \vdash^{\circ} t : \rho \\ \Delta, \ y : \tau \vdash^{\circ} u : \rho \quad t \perp u \end{array} \\ \hline \Gamma \otimes \Delta \quad \vdash^{a} \quad \mathsf{case}^{\circ} \ c \ \mathsf{of} \\ \{ \mathtt{inl} \ x \Rightarrow t \mid \mathtt{inr} \ y \Rightarrow u \} : \rho \end{array} \oplus -\mathrm{elim}^{\circ} \end{array}$$

QML: Quantum data and control. Altenkirch and Grattage, 2005

# Quantum if, take q

$$\begin{array}{c} \Gamma \vdash^{a} c : \sigma \oplus \tau \\ \Delta, \ x : \sigma \vdash^{\circ} t : \rho \\ \Delta, \ y : \tau \vdash^{\circ} u : \rho \quad t \perp u \end{array} \\ \hline \Gamma \otimes \Delta \quad \vdash^{a} \quad \mathsf{case}^{\circ} \ c \ \mathsf{of} \\ \{ \mathsf{inl} \ x \Rightarrow t \mid \mathsf{inr} \ y \Rightarrow u \} : \rho \end{array} \oplus -\mathsf{elim}^{\circ}$$

$$\frac{t \perp u \quad \lambda_0^* \kappa_0 = -\lambda_1^* \kappa_1}{\{(\lambda_0)t \mid (\lambda_1)u\} \perp \{(\kappa_0)t \mid (\kappa_1)u\}} \operatorname{Osup}$$

QML: Quantum data and control. Altenkirch and Grattage, 2005

#### Pattern-matching isomorphisms

$$\begin{array}{l} \texttt{not}: \mathbb{B} \leftrightarrow \mathbb{B} = \left(\begin{array}{cc}\texttt{ff} \ \leftrightarrow \ \texttt{tt} \\ \texttt{tt} \ \leftrightarrow \ \texttt{ff}\end{array}\right),\\\\\texttt{cnot}: \mathbb{B} \otimes \mathbb{B} \leftrightarrow \mathbb{B} \otimes \mathbb{B} = \left(\begin{array}{cc}\langle\texttt{ff}, x \rangle \ \leftrightarrow \ \langle\texttt{ff}, x \rangle \\ \langle\texttt{tt}, \texttt{ff} \rangle \ \leftrightarrow \ \langle\texttt{tt}, \texttt{tt} \rangle \\ \langle\texttt{tt}, \texttt{tt} \rangle \ \leftrightarrow \ \langle\texttt{tt}, \texttt{tt} \rangle\end{array}\right)\end{array}$$

 $\begin{array}{ccc} \operatorname{Had}: \mathbb{B} \leftrightarrow \mathbb{B} \\ \left( \begin{array}{ccc} \operatorname{tt} \ \leftrightarrow \ \frac{1}{\sqrt{2}} \operatorname{tt} + \frac{1}{\sqrt{2}} \operatorname{ff} \\ \operatorname{ff} \ \leftrightarrow \ \frac{1}{\sqrt{2}} \operatorname{tt} - \frac{1}{\sqrt{2}} \operatorname{ff} \end{array} \right) \end{array}$ 

From Symmetric Pattern-Matching to Quantum Control. Sabry, Valiron, Vizzotto, 2018.

# Quantum if, take 2

#### qif $[\overline{q}] : |1\rangle \to P_1$ $\Box \qquad |2\rangle \to P_2$ $\dots$ $\Box \qquad |n\rangle \to P_n$ fiq

Alternation in Quantum Programming: From Superposition of Data to Superposition of Programs. Ying, Yu, and Feng, 2014.

# Quantum if, take 2



# $\mathbf{qif} \ [\overline{q}] : \ |1\rangle \to P_1$ $\Box \qquad |2\rangle \to P_2$

 $|n\rangle \to P_n$ 

#### fiq

Let  $P_1, P_2, ..., P_n$  be a collection of (quantum) programs whose state spaces are the same Hilbert space  $\mathcal{H}$ . We introduce a new family of quantum variables  $\overline{q}$  that do not appear in  $P_1, P_2, ..., P_n$ .

Alternation in Quantum Programming: From Superposition of Data to Superposition of Programs. Ying, Yu, and Feng, 2014.

## Alternation not compositional

 $\mathbf{qif} \ [\overline{q}] : \ |1\rangle \to P_1$  $\Box \qquad |2\rangle \to P_2$ 

# $\Box \qquad |n\rangle \to P_n$ fiq

#### $\llbracket P_1 \rrbracket = \llbracket P'_1 \rrbracket \land \llbracket P_2 \rrbracket = \llbracket P'_2 \rrbracket \not\Rightarrow \llbracket P_1 \rrbracket \bullet \llbracket P_2 \rrbracket = \llbracket P'_1 \rrbracket \bullet \llbracket P'_2 \rrbracket$

Quantum Alternation: Prospects and Problems. Badescu and Panangaden, 2015

#### Takeaways

#### Sources of Abstractions

Physics

→ No-cloning
→ Reversible
→ Superposition

→ Measurement

Computing Technology

→ Circuit model
 → Classical
 → communication

Algorithms

Classical oracles
 Amplification

**PL** Theory

**Semantics** 

Data structures
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#### How to motivate engineers?

How to proceed when the abstractions you have are unsatisfactory?