# From Symmetric Pattern Matching to Quantum Control

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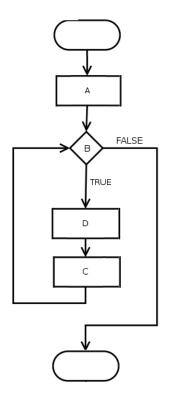
## **Notion of Control**

Control in quantum computation has two meanings

- The control of a unitary, as in the control-not gate
- The control-flow of a program: made of primitives such as
  - Sequences of operations
  - Tests and branchings
  - Loops/fixpoints

The former is an instance of the latter: a quantum control-flow primitive. (albeit limited)

General quantum control-flow is the purpose of this talk



## Plan

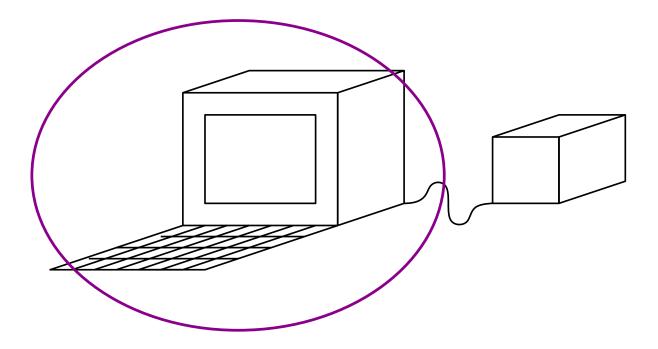
- 1. Classical Control
- 2. The bumpy road towards quantum control
- 3. Detour via reversible computing
- 4. The elusive quantum loop

## Chapter 1

## **Classical Control**

## **Quantum with Classical Control**

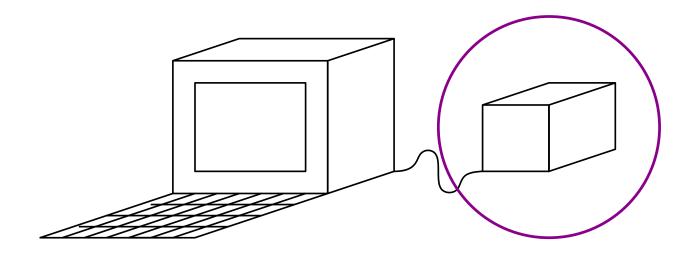
Model of computation



The program lives here

## **Quantum with Classical Control**

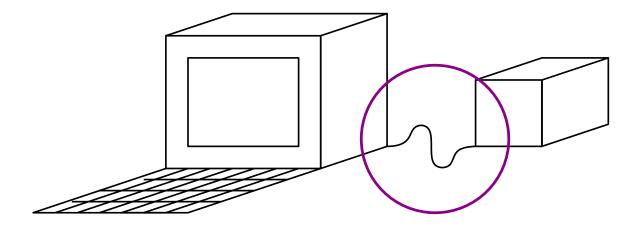
Model of computation



This only holds quantum data

## **Quantum with Classical Control**

Model of computation



Series of instructions/circuit and feedback

## A First-Order Quantum Language

#### Based on the QRAM model $_{\rm [KNILL,1996]}$

- Memory cells are addressable separately
- Instructions/circuit sent down the wire

#### A flow-chart language [Selinger,2004]

- Global environment of bits and qubits
- Simple actions:
  - Local operations
  - Tests of bit-value, loops using control points

#### Denotational semantics

• Positive matrices and norm-non-increasing superoperators

## **Higher-Order Approach**

#### Completely positive maps [Selinger,V]

- Superoperators without the norm condition
- Compact closed structure

Quantum lambda-calculus [Selinger, Pagani, V]

- Adds to the previous approach
  - Higher-order
  - Opaque type qbit
  - Duplicable/non-duplicable data
  - Recursive types (e.g. lists)
  - Fixpoints
- Various categorical models extending CPM
- But only low-level QRAM op. for quantum

## **Circuit Description Languages**

#### In real quantum algorithms

- Circuits described with
  - Explicit series of gates
  - Circuit combinators: Inversion, control, repetition, etc
- Need circuits as first-class objects
- QRAM model not enough

### **Circuit Description Languages**

Extending the quantum  $\lambda$ -calculus with [QUIPPER, 2013], [QWIRE, 2017]

- A new opaque type for circuits: Circ(A, B)
- Box and unbox constructions

$$(A \multimap B) \xrightarrow[]{\text{box}}_{\text{unbox}} \operatorname{Circ}(A, B)$$

- Box: instantiate a new circuit
- Unbox: evaluate a circuit
- A list of fixed, opaque circuits combinators such as

$$\texttt{ctl} : \texttt{Circ}(A, B) \multimap \texttt{Circ}(\texttt{qbit} \otimes A, \texttt{qbit} \otimes B)$$
$$\texttt{rev} : \texttt{Circ}(A, B) \multimap \texttt{Circ}(B, A)$$

• Nice arrow-like, categorical semantics [Selinger&Rios,2017]

## **Circuit Description Languages**

The circuit construction is **CLASSICAL** 

- The circuit is built on the classical machine
- It is instantiated on one particular set of qubits
- and applied regardless of the state of the memory.
- The type Circ(A, B) and the circuit combinators are

- opaque

– non-programmable

Trying to build circuit combinators

• requires the non-available quantum control

## Chapter 2

# The Bumpy Road Towards Quantum Control

## Quantum Control

#### Exhibiting the "control flow" hidden in circuits

- "Quantum" tests
- "Quantum" loops/fixpoints

#### Long-term objective

- Understand the structure of quantum operations
- Syntax for building circuit combinators

Measure of success: How can we say we got quantum control

- Compilation to circuits?
- Modeled as unitary in some Hilbert space?

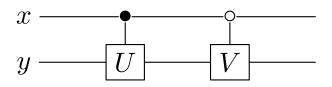
## QML

The first successful attempt at implementing a quantum test:

```
\operatorname{qif}^{\circ} x then Uy else Vy
```

Perform U or V on y conditionally on x without measuring.

• A naïve compilation approach would do



- $\bullet~{\rm if}~U~{\rm and}~V~{\rm are}~{\rm ``orthogonal''}{\,,~{\rm one}~{\rm can}~{\rm get}~{\rm rid}~{\rm of}~x$
- The orthogonality property is hard to state
- But QML compiles down to circuits: fully quantum [Altenkirch&Grattage,2005]

## van Tonder's Quantum $\lambda\text{-Calculus}$

Programs in superposition:[VANTONDER,2004]van Tonder defines a syntactic λ-calculus with

- $\lambda$ -terms in quantum registers
- $\beta$ -reduction as unitary operation
- Constants such as 0, 1 and H:

$$H 0 \longrightarrow \frac{1}{\sqrt{2}}(0+1).$$

The unitarity constraints are too strong

- The terms in superpositions are morally the same
- Turning the language into a purely classical one

## Linear algebraic lambda-calculi

A side track to overcome the issue [Arrighi&Dowek,2008],[DiazCaro&AL]

- Allow linear combinations of terms (aka "superposition")
  - $-\lambda x.M$  is an operator where M can be a linear combination
  - $N(\alpha V + \beta W) \to \alpha(NV) + \beta(NW)$
- Relax the constraints on orthogonality and norm

#### Advantages

- Full power of  $\lambda$ -calculus
- $\bullet~{\rm The}~\beta{\rm -reduction}$  works fine
- Isolate and study separately problems and solutions

**Inconvenient** (for this talk)

• Not completely quantum anymore:

No unitarity nor compilation to circuits

See Alejandro's talk!

## Ying's quantum loops

Mingsheng Ying interprets quantum walk using [YING,2016]

- a quantum, "regular" while-loop
- based on "quantum coins":

while (coin toss yields true) do something end

The quantum coin is implemented as an element of a Fock space

$$\bigoplus_{n=0}^\infty \left(\texttt{qubit}^{\odot n}\right)$$

An element of  $qubit^{\odot n}$  is a qubit that can be used n times

A while-loop on  $\mathtt{qubit}^{\odot n}$ 

- $\bullet \,$  will loop at most  $n \,$  times
- can behave differently on each superposed qubit state
- the loop "stops quantumly"

This construction still calls for a concrete language

## **Limits of current approaches**

#### Quantum control flow

- Quantum tests are fine: can be done with regular control
- Quantum loops are the main road block

#### The following seem slightly incompatible

- Reasonnably expressive language : linear alg.  $\lambda$ -calc
- Satisfactory loops : Ying's approach
- Preservation of unitarity : QML

## Chapter 3

## **Detour via Reversible Computation**

[FoSSACS,2018]

#### **Test with Pattern Matching**

- f : Nat + Nat -> ...
- f (Left 0) -> ...
- f (Left n+1) -> ...
- f (Right n) -> ...

- g : (Bool x Nat) -> ...
- g (True, 0) -> ...
- g (False, n) -> ...
  - g (True, n+1) -> ...

### **Test with Pattern Matching**

- f : Nat + Nat -> ...
- f (Left 0) -> ...
- f (Left n+1) -> ...
- f (Right n) -> ...

- g : (Bool x Nat) -> ...
- g (True, 0) -> ...
- g (False, n) -> ...
  - g (True, n+1) -> ...
- h : Nat + Nat <-> (Bool x Nat) h (Left 0) <-> (True, 0) h (Left n+1) <-> (False, n) h (Right n)  $\langle - \rangle$  (True, n+1)

Conditions for reversible tests [JAMES&SABRY,2014]

- Exhaustivity
- Non-overlapping

Consider the isos  $U: a \leftrightarrow c$  and  $V: b \leftrightarrow d$ .

Then

$$\left\{\begin{array}{rrr} in_l(x) & \leftrightarrow & in_l(U\,x) \\ in_r(y) & \leftrightarrow & in_r(V\,y) \end{array}\right\} : a \oplus b \leftrightarrow c \oplus d$$

Apply U on values of tpe a and V on values of type b.

Consider the isos  $U: a \leftrightarrow c$  and  $V: b \leftrightarrow d$ .

Written as a circuit:  $a \oplus b \leftrightarrow c \oplus d$ 

$$\left\{ \begin{array}{cccc} in_l(x) & \leftrightarrow & \mathrm{do} \ x - \fbox{U} - x' \ \mathrm{return} \ in_l(x') \\ in_r(y) & \leftrightarrow & \mathrm{do} \ y - \fbox{V} - y' \ \mathrm{return} \ in_r(y') \end{array} \right\}$$

Generalized notion of controlled operation

Consider the isos  $U: a \leftrightarrow c$  and  $V: b \leftrightarrow d$ .

Inverting is trivial:

$$\left\{\begin{array}{rrrr} in_l(x') & \leftrightarrow & \mathrm{do} \ x' - \fbox{U^{-1}} - x \ \mathrm{return} \ in_l(x) \\ in_r(y') & \leftrightarrow & \mathrm{do} \ y' - \fbox{V^{-1}} - y \ \mathrm{return} \ in_r(y) \end{array}\right\}$$

as long as U and V are invertible.

Reversible pattern matching: a syntax for circuits...

- $\bullet\,$  with type constructors  $\oplus$  and  $\otimes$
- generalized notion of control

#### Following Quipper/QWIRE we add

- recursive types, e.g.  $[a]\equiv 1\oplus (a\otimes [a])$
- higher-order on isos :
  - iso-variables
  - boxes in circuits can be iso-variables
  - lambda-abstractions  $\lambda f. \{\cdots\}$  and application
  - fixpoints :  $\mu f.\{\cdots\}$

Example of "complex" program: the map operation

Let  $f: a \leftrightarrow b$ Define map  $f: [a] \leftrightarrow [b]$  as  $\mu \mathbf{g}^{[a] \leftrightarrow [b]} \cdot \left\{ \begin{array}{ccc} [] & \leftrightarrow & [] \\ h: t & \leftrightarrow & \operatorname{do} & \frac{h - f - h'}{t - \mathbf{g} - t'} \operatorname{return} h': t' \end{array} \right\}$ 

#### Operational semantics:

- Substituting and circuit unfolding
- The "generated circuit" depends on the shape of the input value
  - map f on a list of size 0 : the identity
  - $\mbox{ map } f$  on a list of size 1 : the map f
  - $-\mbox{ map f on a list of size } n$  : f applied on each wire
- Inversion is still obtained syntactically

In summary, non-overlapping and exhaustivity give

- syntactic inverses
- generalized controls and tests
- fixpoints

Is everything done?

Wait! Why are fixpoints yielding exhaustive patterns?

They are not in general but

- If the fixpoint is non-terminating
  - partial injective maps
  - original semantics of Theseus [JAMES&SABRY,2014]
  - link with inverse categories [KAASGAARD&AL 2017]
- As long as the fixpoint is terminating on all inputs:

The iso describes a bijective map on the sets of values

How to go from classical reversible to quantum?

- linear combination of data  $\equiv$  some sort of side effect
- In the spirit of the monad steaming from the adjunction

 $FinSet \longrightarrow FinVec$ 

• Following what is done in the linear algebraic lambda-calculi

$$M(\alpha \cdot u + \beta \cdot v) \equiv \alpha \cdot (M u) + \beta \cdot (M v)$$

• Caveat: vector spaces + unitary maps is not a coKleisli category

Consider the finite types a, b and their sets of values |a| and |b|:

• An iso  $U: a \leftrightarrow b$  is a bijection between |a| and |b|

Consider the vector space  $\mathbb{C}^{|a|}$ .

- A bijection  $|a| \rightarrow |b|$  is a 0/1, unitary matrix  $\mathbb{C}^{|a| \times |b|}$
- The iso  $U: a \leftrightarrow b$  then yields a unitary map  $\mathbb{C}^{|a|} \to \mathbb{C}^{|b|}$

Consider again isos  $U:a\leftrightarrow c$  and  $V:b\leftrightarrow d$ , and the map

$$\left\{\begin{array}{rrr} in_l(x) & \leftrightarrow & in_l(U\,x) \\ in_r(y) & \leftrightarrow & in_r(V\,y) \end{array}\right\} : a \oplus b \leftrightarrow c \oplus d$$

Control over the branch taken for the  $\oplus$ , yields the matrix:

$$\left(\begin{array}{cc} U & 0 \\ 0 & V \end{array}\right): a \oplus b \longrightarrow c \oplus d.$$

Allowing sum and scalar products over terms, one can generalize.

Consider isos

$$U_{11}: a \leftrightarrow c \qquad \qquad U_{21}: b \leftrightarrow c$$
$$U_{12}: a \leftrightarrow d \qquad \qquad U_{22}: b \leftrightarrow d$$

the map  $a \oplus b \leftrightarrow c \oplus d$ 

$$\begin{cases} in_l(x) &\leftrightarrow \alpha_{11} \cdot in_l(U_{11} x) + \alpha_{12} \cdot in_r(U_{12} x) \\ in_r(y) &\leftrightarrow \alpha_{21} \cdot in_l(U_{21} y) + \alpha_{22} \cdot in_r(U_{22} y) \end{cases}$$

yields a matrix:

$$\left(\begin{array}{ccc} \alpha_{11} \cdot U_{11} & \alpha_{21} \cdot U_{21} \\ \alpha_{12} \cdot U_{12} & \alpha_{22} \cdot U_{22} \end{array}\right) : a \oplus b \longrightarrow c \oplus d.$$

With finite types and the absence of fixpoints

- The previous analysis carries over
- Asking for the unitary of

$$\begin{pmatrix} \alpha_{11} & \alpha_{21} \\ \alpha_{12} & \alpha_{22} \end{pmatrix}$$

entails that isos describe unitaries

- |a| forms an orthonormal basis for  $\mathbb{C}^{|a|}$
- Pattern matching still describes a generalized control

But everything is finite

## Chapter 4

## **The Elusive Quantum Loop**

[FoSSACS,2018]

## **Recursive Types and Unitary Maps**

What about recursive types?

Consider  $[a] \equiv 1 \oplus (a \otimes [a])$ . Unrolling the definition:

 $[a] \equiv 1 \oplus a \oplus (a \otimes a) \oplus (a \otimes a \otimes a) \oplus \cdots$ 

- Let  $U:[a] \leftrightarrow [b]$  defined with
  - Fixpoints
  - linear combinations
  - terminating on all lists  $\boldsymbol{v}$  of type  $\boldsymbol{a}$
- For every list v:a

the term Uv reduces to a linear combination of lists of type b.

- $v \perp w$  but do we have  $Uv \perp Uw$  ?
- $\mathbb{C}^{|[a]|}$  is infinite-dimensional...

## Isos as Unitary Maps in $\ell^2(|a|)$

A candidate model: The Hilbert space  $\ell^2(|[a]|)$ 

- Space of absolute converging sequences indexed with |[a]|.
- Unitary maps U are
  - Surjective
  - Preserving the inner product
  - Bounded:  $||Ux|| \leq \rho ||x||$  for some  $\rho > 0$ .

With enough conditions on fixpoints: iterators

• General isos  $[a] \leftrightarrow [b]$  yield unitaries  $\ell^2(|[a]) \rightarrow \ell^2(|[b])$ 

## Isos as Unitary Maps in $\ell^2(|a|)$

#### For example

 $\mathsf{Consider}\;\mathtt{map}\,\mathtt{Had}\;\mathsf{of}\;\mathtt{type}\;[\mathtt{Bool}]\leftrightarrow[\mathtt{Bool}]$ 

This is the iso

$$\mu \mathbf{g}^{[a] \leftrightarrow [b]} \cdot \begin{cases} \begin{bmatrix} & \leftrightarrow & \end{bmatrix} \\ h:t & \leftrightarrow & \text{do } \\ t & - \mathbf{g} - t' \end{cases} \operatorname{return} h':t' \end{cases}$$

with

$$ext{Had} = \left\{ egin{array}{cccc} ext{true} & \leftrightarrow & rac{1}{\sqrt{2}} \cdot ext{true} + rac{1}{\sqrt{2}} \cdot ext{false} \ ext{false} & \leftrightarrow & rac{1}{\sqrt{2}} \cdot ext{true} - rac{1}{\sqrt{2}} \cdot ext{false} \end{array} 
ight\}$$

## Isos as Unitary Maps in $\ell^2(|a|)$

For example

Apply mapHad of type  $[\texttt{Bool}] \leftrightarrow [\texttt{Bool}]$  on

$$rac{1}{\sqrt{2}}[\texttt{true}] + rac{1}{\sqrt{2}}[\texttt{true},\texttt{true},\texttt{true},\texttt{true}]$$

and get

$$\frac{1}{\sqrt{2}}\left(\texttt{map Had}\left[\texttt{true}\right]\right) + \frac{1}{\sqrt{2}}\left(\texttt{map Had}\left[\texttt{true},\texttt{true},\texttt{true},\texttt{true},\texttt{true}\right]\right)$$

As for Ying's fixpoint, it will "loop"

- 1 time on the first list
- 5 times on the second list

A "natural" notion of quantum loop with "quantum termination"?

## Concluding

In this paper

- We reconciliate QML, the linear algebraic lambda-calculus and Ying's approach.
  - Lists of qubits extends quantum coins
  - Quantum while-loops are simply iterators
- We provide a generalized circuit-construction language with quantum control

## Concluding

Quantum loops/fixpoints form a meaningful concept

• Indeed, they can be modeled with unitaries

### But

Quantum loops/fixpoints makes no sense

- Finite loops are not "real loops": they can be unrolled
- Fixpoints are only interesting on unbounded datatypes
- But circuits on unbounded datatypes require infinite unrolling... quantum non-termination is meaningless

## **Paradoxical?**