A HoTT Quantum Equational Theory

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MURI Project Review University of Maryland

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With Steve Zdancewic at the University of Pennsylvania.

...via embedded languages



...via embedded languages

- Quipper [Green et al., 2013]
 - Embedded in Haskell, a functional lazy language.
 - Uses Haskell types, functions, data structures, type classes, template haskell... to construct quantum circuits.

Access to Haskell REPL and debugging tools.

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- ► LiQUiD, Q language, Project Q, QISKit, pyQuill...

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Access to Haskell REPL and debugging tools.

- ► LiQUiD, Q language, Project Q, QISKit, pyQuill...
- QWIRE [Paykin et al., 2017, Rand et al., 2017]
 - A formal theory of embedded quantum circuits.
 - Implemented as an embedded language in Coq, a theorem prover with dependent types.
 - Uses Coq theorem proving capabilities to prove correctness of quantum circuits.



- Based on Linear/Non-Linear (LNL) logic [Benton, 1995]
- Linear types, pairs (\otimes), etc

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Derived quantum operations:
$${\sf Qubit}={\sf Lower(Bool)}\ |b
angle={\sf put}\ b$$

let
$$b \coloneqq$$
 meas e in $e' = e >! \lambda b.e'$

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Reasoning about quantum data

Denotational semantics

Spaces are exponential in size of program

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Program logics

Best suited to imperative quantum languages

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Reasoning about quantum data

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Equational theory

Syntactic rules that characterize when programs are equivalent.

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May or may not be directed; difficult to normalize.

Validated with respect to denotational semantics.

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Interaction between quantum data and host language control

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NOT equational theory for classes of unitaries

Prior work – Staton [2015]

 Equational theory for algebra with unitaries and classical control.





Prior work - Staton [2015]

 Equational theory for algebra with unitaries and classical control.



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Complete with respect to C*-algebras.

Prior work - Staton [2015]

 Equational theory for algebra with unitaries and classical control.





- Complete with respect to C*-algebras.
- Procedural axioms based on diagrams
 - symmetric monoidal structure



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Specialized to an embedded programming language
 not algebra or diagrams (e.g. ZX calculus [Backens, 2015])

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 Fewer "procedural" axioms, focus on interesting axioms.

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Specialized to an embedded programming language
 not algebra or diagrams (e.g. ZX calculus [Backens, 2015])
 Fewer "procedural" axioms, focus on interesting axioms.
 Completeness of axioms by comparing with Staton's theory.

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• Equality of two terms a = b is a type

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- Constructor: 1_a : a = a

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- Terms of equality type p : a = b called *paths*

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- Path induction:

$$\frac{H: \forall (a, b: A). a = b \rightarrow \mathsf{Type} \qquad \forall (a: A). H(1_a)}{\mathtt{path_ind}_H: \forall (a, b: A). \forall (p: a = b). H(p)}$$

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► Equivalence class of an element a : A with respect to a relation R: [a]_R = [b]_R if (a, b) ∈ R.

Higher Inductive Type (HIT)

Definition

The quotient of a type A by a relation $R : A \rightarrow A \rightarrow$ Prop is a type A/R with data constructor:

 $\frac{a:A}{[a]_R:A/R}$

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... and path constructor:

$$\frac{a, b: A \qquad p: R(a, b)}{[p]: [a]_R = [b]_R}$$

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Note If p, q : R(a, b) and $p \neq q$, then $[p] \neq [q]$.





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So what?

- HITs use paths to represent equivalence relations or groupoids.
- Path induction still holds of HITs:
 - Prove theorems about groupoids by showing property holds of 1_a : a = a.

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Unitary transformations form a groupoid.

• UMatrix(α, β) is the type of unitary matrices of dimension $|\alpha| \times |\beta|$.

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► α, β : FinType

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Quantum types: QType = FinType/UMatrix.

Qubit = [Bool]_{UMatrix}

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• α, β : FinType

Quantum types: QType = FinType/UMatrix.

Qubit = [Bool]_{UMatrix}

Unitaries are paths:

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

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 $\blacktriangleright [H]: Qubit = Qubit$

HoTT QNQ calculus

$$\sigma \in \mathsf{QType} = \mathsf{FinType}/\mathsf{UMatrix}$$

Lower $\alpha \equiv [\alpha]_{\mathsf{UMatrix}}$
 $e \coloneqq x \mid \mathsf{let} \ x \coloneqq e \ \mathsf{in} \ e'$
 $\mid (e_1, e_2) \mid \mathsf{let} \ (x_1, x_2) \coloneqq e \ \mathsf{in} \ e'$
 $\mid \mathsf{put} \ a \mid e > ! \ f \mid \cdots$

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• Derive $|b\rangle$ and meas *e* using Lower

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Derive |b⟩ and meas e using Lower
Derive unitaries...

Unitaries in HoTT QNQ

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

If $\Delta \vdash e : \sigma$ then there exists another expression $\Delta \vdash U \# e : \tau$. (apply the unitary U to e)

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Proof.

By path induction. The proposition is true for 1_{σ} : $\sigma = \sigma$:

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

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

Unitaries in the HoTT QNQ

Theorem

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

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

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Unitaries in the HoTT QNQ

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

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

Proof.

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

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

 $RHS = (1_t \circ U) \# e = U \# e$

Theorem
$$U^{\dagger} \# (U \# e) = e$$

Theorem $U^{\dagger} \# (U \# e) = e$

Theorem $(U_1 \otimes U_2) \# (e_1, e_2) = (U_1 \# e_1, U_2 \# e_2)$

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Theorem $U^{\dagger} \# (U \# e) = e$

Theorem $(U_1 \otimes U_2) \# (e_1, e_2) = (U_1 \# e_1, U_2 \# e_2)$

Theorem discard(meas(U # e)) = discard(meas(e))



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Theorem $U^{\dagger} \# (U \# e) = e$

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Theorem discard(meas(U # e)) = discard(meas(e))



Theorem $X \# |0\rangle = |1\rangle$

$$\mathit{meas}(X \ \# \ e) = \neg \mathit{meas}(e)$$

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...but not everything

Theorem $SWAP \# (e_1, e_2) = (e_2, e_1)$ Proof. ????

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...but not everything

Theorem $SWAP \# (e_1, e_2) = (e_2, e_1)$ Proof. ????

Theorem let (x, y) := SWAP # e in e' = let <math>(y, x) := e in e'Proof. ????

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Theorem $SWAP \# (e_1, e_2) = (e_2, e_1)$ Proof. ???? Theorem let (x, y) := SWAP # e in e' = let (y, x) := e in e'Proof. ????

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Similar results for behavior of other "structural" unitaries:

ASSOC :
$$\sigma_1 \otimes (\sigma_2 \otimes \sigma_3) = (\sigma_1 \otimes \sigma_2) \otimes \sigma_3$$

LUNIT : () $\otimes \sigma = \sigma$

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SWAP is a structural equivalence of type $\forall X, Y. X \otimes Y \rightarrow Y \otimes X$ defined by the function

$$swap(x, y) = (y, x)$$

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SWAP is a structural equivalence of type $\forall X, Y. X \otimes Y \rightarrow Y \otimes X$ defined by the function

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Structural equivalences all correspond to unitaries

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

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Structural equivalences all correspond to unitaries

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

The *partial initialization* a state $X \otimes Y$ is a pair of expressions.

$$\operatorname{init}_{X} e \equiv e$$

 $\operatorname{init}_{\operatorname{Qubit}} (b : \operatorname{Bool}) \equiv |b\rangle$
 $\operatorname{init}_{\sigma \otimes \tau} (a, b) \equiv (\operatorname{init}_{\sigma} a, \operatorname{init}_{\tau} b)$

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The *partial initialization* a state $X \otimes Y$ is a pair of expressions.

$$\begin{array}{l} \operatorname{init}_{X} e \equiv e \\ \operatorname{init}_{\operatorname{Qubit}} (b : \operatorname{Bool}) \equiv |b\rangle \\ \operatorname{init}_{\sigma \otimes \tau} (a, b) \equiv (\operatorname{init}_{\sigma} a, \operatorname{init}_{\tau} b) \end{array}$$

Axiom

Let f be a structural equivalence. Then

 $\widehat{f} \# init(b) \approx init(f(b))$

Partial measurement axiom

Partial measurement or partial observation:

match_X e with f = let x := e in f xmatch_{Qubit} e with f = e > ! fmatch_{$\sigma \otimes \tau$} e with f = let (x, y) := e inmatch_{σ} x with (match_{τ} y with f(x, y))

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Partial measurement axiom

Partial measurement or partial observation:

match_X e with
$$f = \text{let } x \coloneqq e \text{ in } f x$$

match_{Qubit} e with $f = e > ! f$
match _{$\sigma \otimes \tau$} e with $f = \text{let } (x, y) \coloneqq e \text{ in}$
match _{σ} x with (match _{τ} y with $f(x, y)$)

Axiom

Let f be a structural equivalence. Then:

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

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Two axioms:

- structural unitaries + initialization
- structural unitaries + measurement

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Two axioms:

- structural unitaries + initialization
- structural unitaries + measurement
- Quantum programming language embedded in HoTT

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(Finite) classical data, tuples, and sums

Two axioms:

- structural unitaries + initialization
- structural unitaries + measurement
- Quantum programming language embedded in HoTT
 - (Finite) classical data, tuples, and sums
- Complete with respect to Staton's equational theory

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Two axioms:

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- structural unitaries + measurement
- Quantum programming language embedded in HoTT
 - (Finite) classical data, tuples, and sums
- Complete with respect to Staton's equational theory

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Sound with respect to density matrices

Pros: theorems for free with path induction

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Cons:

- theorems not actually free
- no normalization
- steep learning curve

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- Takeaway: Equations stem (mostly) from quantum data/classical control, not artificial axioms

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Thanks!

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Questions?

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