Alessandro Scala



Quantum Abstract Interpretation

Seminar for the Introduction to Quantum Computing course

Università di Pisa Dipartimento di Informatica

Pisa, 24 Luglio 2023

Roadmap

- Introduction
 Reasons
 Abstract Interpretation
- 2 Preliminaries Density Matrix Reduced Density Matrix
- 3 Abstract Domain Abstraction and Concretization Functions Abstract Operations Assertions
- 4 Conclusions



Introduction

As quantum computing advances, we would like to have some means to prove correctness properties on quantum programs, *especially* since quantum programming is counterintuitive.



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No: **exponential** space and time cost.



$$n_{qubits}=1$$

$$|0\rangle\langle 0|$$

$$\begin{pmatrix} 1 & 0 \\ 0 & 0 \end{pmatrix}$$

 $2^2 = 4$ complex numbers



$$n_{qubits} = 2$$

$$|00\rangle\langle00|$$

$$2^4 = 16$$
 complex numbers



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$$n_{qubits} = 3$$

$$|000\rangle\,\langle000|$$

 $2^6 = 64$ complex numbers



$$n_{qubits} = 300$$

$$\left|0\right>^{\otimes_{300}}\left<0\right|^{\otimes_{300}}$$

?????



$$n_{qubits} = 300$$

$$|0\rangle^{\otimes_{300}} \langle 0|^{\otimes_{300}}$$

 $2^{600} = 41495155688809929585124078636911611510124462322424368 \\ 999956573296906528114129081463997070489471037942881978866113 \\ 007891823951510754117753078868748341139636870611818034015095 \\ 23685376$

Bigger than the number of atoms in the universe.



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Solution: abstract interpretation

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Abstract interpretation is usually sound, but not complete:

- Al returns true ⇒ Property is true
- Al returns false ⇒ Property can be either true or false



Abstract domain



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 - Concretization function: from more abstract to more concrete domain
 - Abstract operations: to represent concrete operations in the abstract domain
- Assertions: properties we can prove with abstract interpretation



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Instead of dealing with a state $|\phi\rangle$ in vector form, we use its density matrix:

$$\rho_{\phi} = |\phi\rangle \langle \phi|$$
 (For a pure state)

- positive semi-definite
- $Tr(\rho) = 1$
- projection $(P = P^{\dagger} = P^2)$



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Example:

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$$\begin{split} |\beta_{00}\rangle &= \frac{|00\rangle + |11\rangle}{\sqrt{2}} \\ \rho_{\beta_{00}} &= |\beta_{00}\rangle \left\langle \beta_{00} \right| = \frac{1}{2}(|00\rangle + |11\rangle)(\left\langle 00 \right| + \left\langle 11 \right|) \\ &= \frac{1}{2}(|00\rangle \left\langle 00 \right| + |00\rangle \left\langle 11 \right| + |11\rangle \left\langle 00 \right| + |11\rangle \left\langle 11 \right|) \end{split}$$



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Suppose we have a composite quantum system $AB=A\otimes B$, and we want to focus our attention on a state $|\phi\rangle\in AB$ with respect to subsystem A.



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$$Tr_{B}[\rho] : AB \to A \qquad Tr_{A}[\rho] : AB \to B$$

$$Tr_{B}[\alpha \otimes \beta] = \alpha \cdot Tr(\beta) \qquad Tr_{A}[\alpha \otimes \beta] = Tr(\alpha) \cdot \beta$$

$$Tr_{S}[\rho + \sigma] = Tr_{S}[\rho] + Tr_{S}[\sigma]$$

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Partial trace $Tr_B[\rho]$ traces out subsystem B.



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$$\begin{split} A &= \mathbb{C}^2 \times \mathbb{C}^2 \quad B = \mathbb{C}^2 \times \mathbb{C}^2 \quad AB = A \otimes B \\ \rho_{\beta_{00}} &= \left|\beta_{00}\right\rangle \left\langle\beta_{00}\right| = \frac{\left|00\right\rangle \left\langle00\right| + \left|00\right\rangle \left\langle11\right| + \left|11\right\rangle \left\langle00\right| + \left|11\right\rangle \left\langle11\right|}{2} \end{split}$$

$$Tr_B[\rho_{\beta_{00}}] =$$



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$$= \frac{\left(|0\rangle\langle0|\cdot\langle0|0\rangle\right) + \left(|0\rangle\langle1|\cdot\langle0|1\rangle\right) + \left(|1\rangle\langle0|\cdot\langle1|0\rangle\right) + \left(|1\rangle\langle1|\cdot\langle1|1\rangle\right)}{2}$$



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Loss of precision

Computing a reduced density matrix discards information!

$$\begin{split} \rho_{\beta_{00}} = & \frac{\left|00\right\rangle\left\langle00\right| + \left|00\right\rangle\left\langle11\right| + \left|11\right\rangle\left\langle00\right| + \left|11\right\rangle\left\langle11\right|}{2} & \text{(Pure state)} \\ \rho_{2} = & \frac{\left|00\right\rangle\left\langle00\right| + \left|01\right\rangle\left\langle01\right| + \left|10\right\rangle\left\langle10\right| + \left|11\right\rangle\left\langle11\right|}{4} & \text{(Mixed state)} \end{split}$$



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$$Tr_{\mathcal{B}}[\rho_{\beta_{00}}] = \frac{|0\rangle \langle 0| + |1\rangle \langle 1|}{2} = Tr_{\mathcal{B}}[\rho_{2}]$$

The partial traces of two different initial states can be equal.

For a state $\rho \in A \otimes B$, even if we know $Tr_B[\rho]$ and $Tr_A[\rho]$, we cannot uniquely determine ρ .



Projection Subspaces

Each projection P corresponds to a linear subspace $S_P = \{v \mid Pv = v\}.$



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This duality between projections and subspaces will be employed multiple times and will often be implied.



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Intuitively, given a tuple S of sets of qubits, an abstract state $\overline{\sigma} \in AbsDom(S)$ is a tuple of projections over those qubits.



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Special case:

$$T = ([n]) \Rightarrow AbsDom(T) \simeq \mathcal{D}$$



Fineness Relation

Let
$$S=(s_1,...,s_m)$$
 and $T=(t_1,...,t_m)$ (with $1\leq m\leq 2^n$), then:
$$\underbrace{S\unlhd\mathcal{T}}_{\text{"T is finer than S"}} \triangleq \forall i\in[m].\ s_i\subseteq t_i$$

T is "more concrete" than S.



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Greatest element: $\top = ([n], ...[n]) = [n]^m$.



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 $AbsDom(\bot)$ corresponds to a state so abstract that it holds no information at all.

 $AbsDom(\top)$ corresponds to tuples where every projection is a concrete state.



 $S \subseteq T \triangleq \forall i \in [m]. \ s_i \subseteq t_i$

 $\alpha_{T \to S} : AbsDom(T) \to AbsDom(S)$





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$$\alpha_{T \to S}(Q_{t_1}, ..., Q_{t_m}) = (P_{s_1}, ..., P_{s_m})$$

$$P_{s_i} = \bigcap_{t_j. \ s_i \subseteq t_J} supp(Tr_{t_j \setminus s_i}[Q_{t_j}])$$

Given an abstract state $\overline{\tau} \in AbsDom(T) = (Q_{t_1}, ..., Q_{t_m})$, we want to compute $\overline{\sigma} \in AbsDom(S) = (P_{s_1}, ..., P_{s_m})$. For each $i \in [m]$:



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- **1** Find all Q_{t_j} s such that $s_i \subseteq t_j$. We know that at least one exists (for j = i), since $S \subseteq T$.
- **2** For each Q_{t_j} found, trace out the qubits in t_j that are not in S_i .

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- **2** For each Q_{t_j} found, trace out the qubits in t_j that are not in $A_i D_j$ S_j .
- 3 Compute the support of the traced matrices (to preserve the structure of projections).
- 4 Compute the intersection of the supports.



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 $\gamma_{S \to T} : AbsDom(S) \to AbsDom(T)$





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- Find all P_{s_i} s such that $s_i \subseteq t_j$. We know at least one exists (for i = j), since $S \subseteq T$.
- **2** Extend the projection to the space of all qubits in t_j , by computing the tensor product with the identity matrix.



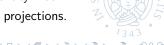
$$S riangleleft T riangleleftharpoons T : AbsDom(S) o AbsDom(T)
onumber
$$\gamma_{S o T} : AbsDom(S) o AbsDom(T)$$

$$\gamma_{S o T}(P_{s_1}, ..., P_{s_m}) = (Q_{t_1}, ..., Q_{t_m})$$

$$Q_{t_j} = \bigcap_{s_i. \ s_i \subseteq t_j} P_{s_i} \otimes I_{t_j \setminus s_i}$$$$

Given an abstract state $\overline{\sigma} \in AbsDom(S) = (P_{s_1}, ..., P_{s_m})$, we want to compute $\overline{\tau} \in AbsDom(T) = (Q_{t_1}, ..., Q_{t_m})$. For each $j \in [m]$:

- Find all P_{s_i} s such that $s_i \subseteq t_j$. We know at least one exists (for i = j), since $S \subseteq T$.
- **2** Extend the projection to the space of all qubits in t_j , by computing the tensor product with the identity matrix.
- 3 Compute the intersection of the extended projections.



Operations on the concrete domain are unitary operators U. To apply them to a concrete state ρ we compute $U\rho U^{\dagger}$. We want to define $U^{\sharp}: AbsDom(S) \rightarrow AbsDom(S)$.



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Let
$$U^{cg}(\overline{\sigma})=(UT_{t_1}U^{\dagger},...,UT_{t_m}U^{\dagger})$$
, then

$$U^{\sharp} = \alpha_{T \to S} \circ U^{\mathsf{cg}} \circ \gamma_{S \to T}$$



Focus

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$$\textit{AbsDom}(S) \xrightarrow[\mathsf{Focus}]{\gamma_{S \to T}} \textit{AbsDom}(T) \xrightarrow[\mathsf{Apply}]{\textit{Ucg}} \textit{AbsDom}(T) \xrightarrow[\mathsf{Infocus}]{\alpha_{T \to S}} \textit{AbsDom}(S)$$



$$U^{\sharp} = \alpha_{T \to S} \circ U^{cg} \circ \gamma_{S \to T}$$

$$AbsDom(S) \xrightarrow{\gamma_{S \to T}} AbsDom(T) \xrightarrow{U^{cg}} AbsDom(T) \xrightarrow{\alpha_{T \to S}} AbsDom(S)$$

Focus - concretize to a new, finer domain with sufficient precision to accurately represent the operation;



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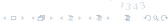
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Unfocus - abstract back to the original abstract domain to keep the representation more compact



Assertions

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And a projection proj(A) onto this subspace, such that:

$$proj(A)v_1 = v_1$$
 $proj(A)v_2 = v_2$



Order Relation on Abstract States

$$1 \leq m \leq 2^{n}, \quad S = (s_{1},...s_{m}), \quad \forall i \in [m]. \ s_{i} \subseteq [n]$$

$$\overline{\sigma} \in AbsDom(S) = (P_{s_{1}},...,P_{s_{m}}), \quad \overline{\tau} \in AbsDom(S) = (Q_{s_{1}},...,Q_{s_{m}})$$

$$\overline{\sigma} \sqsubseteq \overline{\tau} \triangleq \forall i \in [m]. \ \underline{P_{s_i}} \subseteq \underline{Q_{s_i}}$$

Subspace interpretation of projections



Monotonicity and Galois Connection

Monotonicity of abstraction, concretization, and abstract operations:

$$S \subseteq T$$

$$\forall \overline{\sigma}, \overline{\tau} \in AbsDom(T).$$

$$(\overline{\sigma} \sqsubseteq \overline{\tau} \Rightarrow \alpha_{T \to S}(\overline{\sigma}) \sqsubseteq \alpha_{T \to S}(\overline{\tau})$$

$$\wedge$$

$$\overline{\sigma} \sqsubseteq \overline{\tau} \Rightarrow \gamma_{T \to S}(\overline{\sigma}) \sqsubseteq \gamma_{T \to S}(\overline{\tau})$$

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Galois connection:

$$\forall \overline{\sigma} \in AbsDom(S). \ \forall \overline{\tau} \in AbsDom([n]^m).$$
$$\overline{\tau} \sqsubseteq \gamma_{S \to [n]^m}(\overline{\sigma}) \quad \Leftrightarrow \quad \alpha_{[n]^m \to S}(\overline{\tau}) \sqsubseteq \overline{\sigma}$$



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For an assertion A, if S is connected, then:

$$proj(A) = \gamma_{S \to [n]^m}(\alpha_{[n]^m \to S}(proj(A)))$$



Assertion Checking

Given an assertion A, if the final state of a computation is v and the final abstract state of the abstract interpretation is $\overline{v} \in AbsDom(S)$, with S connected, then:

$$\overline{v} \sqsubseteq \alpha_{[n]^m \to S}(proj(A)) \quad \Rightarrow \quad v \in A$$



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Essentially, if the abstract state satisfies the assertion, then the concrete one does as well.



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Fundamental choice for the shape of the abstract domain and, in turn, the success of the analysis.



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Less, smaller sets	Less computational cost and memory footprint	Less precision
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Examples:

- $S_0 = \text{all } 2^n \text{ combinations of up to } n \text{ qubits}$
- $S_1 = \text{all } \binom{n}{k}$ combinations of exactly k qubits
- $S_2 = \text{sets that contain qubits used by at least two 3-qubit gates}$
- ...



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- U_1 acts on qubits $\{1,2,3\}$ with $\{1,2\}$ as input and $\{3\}$ as output.
- U_2 acts on qubits $\{3,4,5\}$ with $\{3,4\}$ as input and $\{5\}$ as output.



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A good choice which would improve the precision of the abstract interpretation is to have the set $\{1, 2, 3, 4, 5\}$ in the abstract state.

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With this abstract interpretation framework, we can prove the loop invariant:

$$|\phi\rangle^{(t)} \in A = span\{|\beta\rangle, |\phi\rangle\}$$



$$P(v) \triangleq v \in A = span\{\ket{\beta}, \ket{\phi}\}$$



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We need to check:

$$P\left(|\phi\rangle^{(t)}\right) \Rightarrow P\left(|\phi\rangle^{(t+1)}\right) \triangleq |\phi\rangle^{(t)} \in A \Rightarrow G|\phi\rangle^{(t)} \in A$$

$$G |\phi\rangle^{(t)} \in A = G |\beta\rangle \in A \land G |\phi\rangle \in A$$
 By linearity of G and $|\phi\rangle^{(t)} \in A$



Roadmap

- Introduction
 Reasons
 Abstract Interpretation
- Preliminaries
 Density Matrix
 Reduced Density Matrix
- 3 Abstract Domain Abstraction and Concretization Functions Abstract Operations Assertions
- 4 Conclusions



Future developments

- Programs with measurements
- Conditionals
- Loops
- Mix of classical and quantum computation
- Choosing the optimal abstract space
- Other kinds of assertions



Computing the Projection of a Support

[noframenumbering] To compute a projection corresponding to supp(A), we:

- 1 take the rows $\{r_1, ..., r_n\}$ of A;
- **2** extract an orthonormal set of vectors $\{b_1, ..., b_n\}$ that span the same subspace as the rows;
- 4 return BB^{\dagger} .



Computing the Projection of an Intersection

[noframenumbering]

$$\{P_1,...,P_k\}, \quad \forall i \in [k]. \ P_i = C^n \times C^n$$

$$\bigcap_{i \in [k]} P_i \triangleq I_n - supp(kI_n - \sum_{i \in [k]} P_i)$$



Computing the Assertion Projection

[noframenumbering] Given two vectors

$$v_1 = |a_1\rangle ... |a_n\rangle$$

 $v_2 = |b_1\rangle ... |b_n\rangle$

$$\textbf{ 1 Create a matrix } P = \begin{pmatrix} v_1' \\ v_2^T \\ \mathbf{0} \\ \dots \\ \mathbf{0} \end{pmatrix}$$

 \bigcirc Return supp(P)



Partial trace

$$Tr_B[\rho] = \sum_{v=0}^{2^m} (I_A \otimes \langle v |) \rho(I_A \otimes | v \rangle) \quad Tr_A[\rho] = \sum_{v=0}^{2^n} (\langle v | \otimes I_B) \rho(| v \rangle \otimes I_B)$$

Where v labels vectors of an orthonormal basis of the subspace we are tracing out.



Weak Galois Connection

$$S \subseteq T$$

$$\forall \overline{\sigma} \in AbsDom(S). \ \forall \overline{\tau} \in AbsDom(T).$$

$$\overline{\tau} \sqsubseteq \gamma_{S \to T}(\overline{\sigma}) \Rightarrow \alpha_{T \to S}(\overline{\tau}) \sqsubseteq \overline{\sigma}$$

$$\wedge$$

$$(\exists \overline{\rho} \in AbsDom([n]^m). \ \overline{\tau} = \alpha_{[n]^m \to T}(\overline{\rho})) \ \Rightarrow \ \overline{\tau} \sqsubseteq \gamma_{S \to T}(\overline{\sigma}) \Leftrightarrow \alpha_{T \to S}(\overline{\tau}) \sqsubseteq \overline{\sigma}$$



