

Models of complexity growth and random quantum circuits

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June 25, 2019

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Based on:

[Kuong, NHJ, Chemsyany, Brandão, Preskill], 1907.hopefully soon

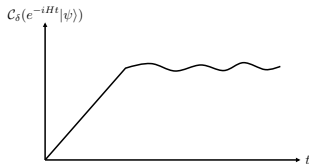
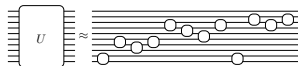
[NHJ], 1905.12053

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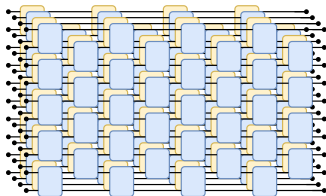
work in progress with Richard Kueng, Wissam Chemissany, Fernando Brandão, John Preskill



[Richard Kueng]

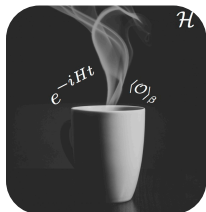


as well as [NHJ, “Unitary designs from statistical mechanics in random quantum circuits,” arXiv:1905.12053]
(talk at the QI workshop 2 weeks ago)



We are interested in understanding **universal** aspects of strongly-interacting systems

→ specifically in their real-time dynamics



Thermalization



Quantum chaos



Complexity



Transport

understanding these has implications in high-energy, condensed matter, and quantum information

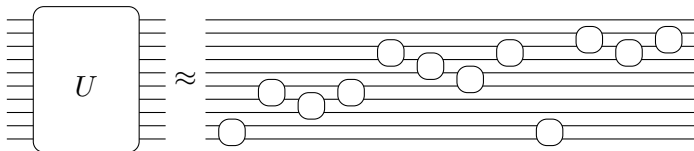
we'll focus on **complexity** in **quantum mechanical** systems

Complexity

some intuition

Complexity is a somewhat **intuitive** notion

The **traditional definition** involves building a circuit with gates drawn from a universal gate set, which **implements** the state or unitary to within some tolerance



We are interested in the **minimal size** of a circuit that achieves this

Complexity

a panoply of references

we've heard a lot about complexity growth already in this workshop

e.g. talks by Rob Myers, Vijay Balasubramanian, and Thom Bohdanowicz;
in talks later today/this week by Bartek Czech, Gabor Sarosi, Shira Chapman; and in many posters

and much progress has been made in studying complexity growth
in holographic systems

[Susskind], [Stanford, Susskind], [Brown, Roberts, Susskind, Swingle, Zhao], [Susskind, Zhao], [Couch, Fischler, Nguyen], [Carmi, Myers, Rath], [Brown, Susskind], [Caputa, Magan], [Alishahiha], [Chapman, Marrochio, Myers], [Carmi, Chapman, Marrochio, Myers, Sugishita], [Caputa, Kundu, Miyaji, Takayanagi, Watanabe], [Brown, Susskind, Zhao], [Agón, Headrick, Swingle], ...

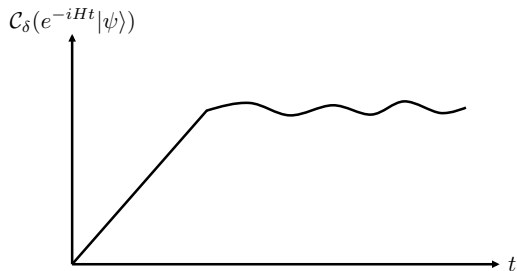
as well as extending definitions to understand a notion of
complexity in QFT

[Chapman, Heller, Marrochio, Pastawski], [Jefferson, Myers], [Hackl, Myers], [Yang], [Chapman, Eisert, Hackl, Heller, Jefferson, Marrochio, Myers], [Guo, Hernandez, Myers, Ruan], ...

Complexity

some expectations

it is believed (/expected/conjectured) that the **complexity** of a simple initial state grows (**possibly linearly**) under the time-evolution by a **chaotic** Hamiltonian



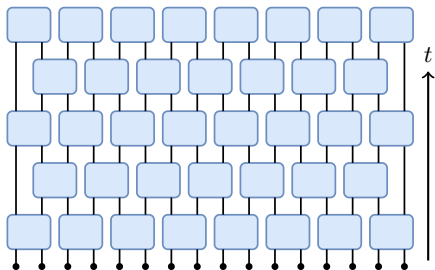
saturation after an **exponential time**

computing the **quantum complexity** analytically is very **hard** (especially for a fixed chaotic H and $|\psi\rangle$)

→ we'll focus on ensembles of time-evolutions (RQCs)

Our goal

Consider random quantum circuits, a **solvable model of chaotic dynamics**
we take local RQCs on n **qudits** of **local dimension** q , with gates drawn randomly from a universal gate set G



and try to derive exact results for the **growth of complexity**

Overview

- ▶ Define complexity
- ▶ Complexity by design
- ▶ Complexity in local random circuits
- ▶ Solving random circuits
- ▶ (complexity from measurements)

State complexity

more serious version

Consider a system of n qudits with local dimension q , where $d = q^n$

Complexity of a state: the **minimal size** of a circuit that builds the state $|\psi\rangle$ from $|0\rangle$

We assume the circuits are built from elementary 2-local gates chosen from a universal gate set G . Let G_r denote the set of all circuits of size r .

Definition (δ -state complexity)

Fix $\delta \in [0, 1]$, we say that a state $|\psi\rangle$ has δ -complexity of at most r if there exists a circuit $V \in G_r$ such that

$$\frac{1}{2} \left\| |\psi\rangle\langle\psi| - V|0\rangle\langle 0|V^\dagger \right\|_1 \leq \delta,$$

which we denote as $\mathcal{C}_\delta(|\psi\rangle) \leq r$.

Unitary complexity

more serious version

Consider a system of n qudits with local dimension q , where $d = q^n$

Complexity of a unitary: the minimal size of a circuit, built from a 2-local gates from G , that approximates the unitary U

Definition (δ -unitary complexity)

We say that a unitary $U \in U(d)$ has δ -complexity of at most r if there exists a circuit $V \in G_r$ such that

$$\frac{1}{2} \|\mathcal{U} - \mathcal{V}\|_{\diamond} \leq \delta,$$

where $\mathcal{U} = U(\rho)U^\dagger$ and $\mathcal{V} = V(\rho)V^\dagger$,

which we denote as $\mathcal{C}_\delta(U) \leq r$.

Complexity by design

We start with some general statements about the **complexity** of **unitary k -designs**

related ideas were presented in [Roberts, Yoshida] relating the frame potential to the average complexity of an ensemble

But first, we need to define the notion of a **unitary design**

Unitary k -designs

Haar: (unique L/R invariant) measure on the unitary group $U(d)$

The k -fold channel, with respect to the Haar measure, of an operator \mathcal{O} acting on $\mathcal{H}^{\otimes k}$ is

$$\Phi_{\text{Haar}}^{(k)}(\mathcal{O}) \equiv \int_{\text{Haar}} dU U^{\otimes k}(\mathcal{O})U^{\dagger \otimes k}$$

For an ensemble of unitaries $\mathcal{E} = \{p_i, U_i\}$, the k -fold channel of an operator \mathcal{O} acting on $\mathcal{H}^{\otimes k}$ is

$$\Phi_{\mathcal{E}}^{(k)}(\mathcal{O}) \equiv \sum_i p_i U_i^{\otimes k}(\mathcal{O})U_i^{\dagger \otimes k}$$

An ensemble of unitaries \mathcal{E} is an **exact k -design** if

$$\Phi_{\mathcal{E}}^{(k)}(\mathcal{O}) = \Phi_{\text{Haar}}^{(k)}(\mathcal{O})$$

e.g. $k = 1$ and Paulis, $k = 2, 3$ and the Clifford group

Unitary k -designs

Haar: (unique L/R invariant) measure on the unitary group $U(d)$

k -fold channel: $\Phi_{\mathcal{E}}^{(k)}(\mathcal{O}) \equiv \sum_i p_i U_i^{\otimes k}(\mathcal{O}) U_i^{\dagger \otimes k}$

exact k -design: $\Phi_{\mathcal{E}}^{(k)}(\mathcal{O}) = \Phi_{\text{Haar}}^{(k)}(\mathcal{O})$

but for general k , few exact constructions are known

Definition (Approximate k -design)

For $\epsilon > 0$, an ensemble \mathcal{E} is an ϵ -approximate k -design if the k -fold channel obeys

$$\left\| \Phi_{\mathcal{E}}^{(k)} - \Phi_{\text{Haar}}^{(k)} \right\|_{\diamond} \leq \epsilon$$

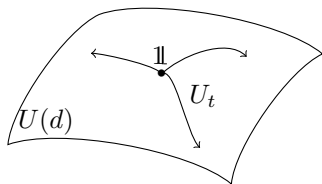
→ designs are powerful

Intuition for k -designs

(eschewing rigor)

How **random** is the time-evolution of a system compared to the full unitary group $U(d)$?

Consider an **ensemble of time-evolutions** at a fixed time t : $\mathcal{E}_t = \{U_t\}$
e.g. RQCs, Brownian circuits, or $\{e^{-iHt}, H \in \mathcal{E}_H\}$ generated by disordered Hamiltonians



quantify **randomness**:
when does \mathcal{E}_t form a k -design?
(approximating moments of $U(d)$)

Complexity by design

an exercise in enumeration

Consider a **discrete approximate unitary design** $\mathcal{E} = \{p_i, U_i\}$.

Can we say anything about the complexity of U_i 's?

The structure of a design is sufficiently restrictive, can **count** the number of unitaries of a specific complexity

Theorem (Complexity for unitary designs)

For $\delta > 0$, an ϵ -approximate unitary k -design contains at least

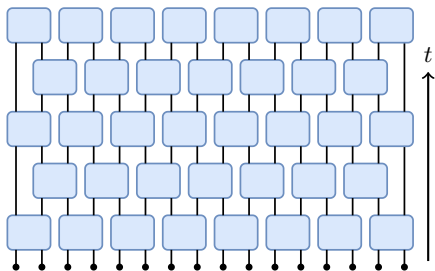
$$M \geq \frac{d^{2k}}{k!} \frac{1}{(1 + \epsilon')^k} - \frac{n^r |G|^r}{(1 - \delta^2)^k}$$

unitaries U with $\mathcal{C}_\delta(U) > r$.

This is essentially $\approx (d^2/k)^k$ for $r \lesssim kn$ (exp growth in design k)

Random quantum circuits

Consider G -local RQCs on n qudits of local dimension q , evolved with staggered layers of 2-site unitaries, each drawn randomly from a universal gate set G



where evolution to time t is given by $U_t = U^{(t)} \dots U^{(1)}$

RQCs and randomness

Now we need a powerful result from [Brandão, Harrow, Horodecki]

Theorem (*G*-local random circuits form approximate designs)

For $\epsilon > 0$, the set of all G -local random quantum circuits of size T forms an ϵ -approximate unitary k -design if

$$T \geq cn [\log k]^2 k^{10} (n + \log(1/\epsilon))$$

where c is a (potentially large) constant depending on the universal gate set G .

Less rigorous version: RQCs of size $T \sim n^2 k^{10}$ form k -designs

Complexity by design

curbing collisions

Now we can combine these two results to say something about the **complexity of states** generated by **G -local random circuits**

Fix some initial state $|\psi_0\rangle$, and consider the set of states generated by G -local RQCs: $\{U_i |\psi_0\rangle, U_i \in \mathcal{E}_{G\text{-local RQC}}\}$

Obviously, at **early times**: $\mathcal{C}_\delta(|\psi\rangle) \approx T$

but we must account for **collisions**: $U_1 |\psi_0\rangle \approx U_2 |\psi_0\rangle$

and collisions must dominate at **exponential times** as the complexity saturates

but the definition of an ϵ -approximate design **restricts** the number of potential collisions

→ allows us to count the $\#$ of **distinct** states

Complexity by design

curbing collisions

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Fix some initial state $|\psi_0\rangle$, and consider the set of states generated by G -local RQCs: $\{U_i |\psi_0\rangle, U_i \in \mathcal{E}_{G\text{-local RQC}}\}$

For $r \leq \sqrt{d}$, G -local RQCs of size T , where $T \geq cn^2(r/n)^{10}$, generate at least

$$M \gtrsim c' e^{r \log n}$$

distinct states with $\mathcal{C}_\delta(|\psi\rangle) > r$.

This establishes a **polynomial relation** between the growth of complexity and size of the circuit up to $r \leq \sqrt{d}$

→ but what we really want is **linear growth**

RQCs and $T \sim k$

an appeal for linearity

To get a **linear growth in complexity** we need a **linear growth in design**

we had $T = O(n^2k^{10})$, but would need $T = O(n^2k)$

[Brandão, Harrow, Horodecki]: a **lower bound** on the k -design depth for RQCs is $O(nk)$

Can we prove that RQCs saturate this lower bound? (and are thus optimal implementations of k -designs)

k -designs from stat-mech in RQCs

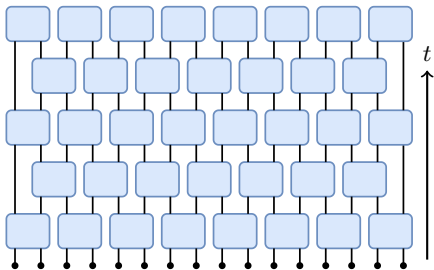
I'll now briefly summarize the result mentioned two weeks ago

using an exact stat-mech mapping, we can show that RQCs form k -designs in $O(nk)$ depth in the limit of large local dimension

this was for local Haar-random gates, but we believe it should extend to G -local circuits with any local dimension q

Random quantum circuits

Consider local RQCs on n qudits of local dimension q , evolved with staggered layers of 2-site unitaries, each drawn randomly from the Haar measure on $U(q^2)$



where evolution to time t is given by $U_t = U^{(t)} \dots U^{(1)}$

Study the convergence of random quantum circuits to **unitary k -designs**,
i.e. depth where we start approximating moments of the unitary group

Our approach

- ▶ Focus on 2-norm and analytically compute the **frame potential** for random quantum circuits
- ▶ Making use of the ideas in [Nahum, Vijay, Haah], [Zhou, Nahum], we can write the **frame potential** as a **lattice partition function**
- ▶ We can compute the $k = 2$ frame potential exactly, but for general k we must sacrifice some precision
- ▶ We'll see that the decay to **Haar-randomness** can be understood in terms of **domain walls** in the lattice model

Frame potential

The frame potential is a tractable measure of Haar randomness, defined for an ensemble of unitaries \mathcal{E} as [Gross, Audenaert, Eisert], [Scott]

$$k\text{-th frame potential : } \mathcal{F}_{\mathcal{E}}^{(k)} = \int_{U, V \in \mathcal{E}} dU dV |\text{Tr}(U^\dagger V)|^{2k}$$

For any ensemble \mathcal{E} , the frame potential is **lower bounded** as

$$\mathcal{F}_{\mathcal{E}}^{(k)} \geq \mathcal{F}_{\text{Haar}}^{(k)} \quad \text{and} \quad \mathcal{F}_{\text{Haar}}^{(k)} = k! \quad (\text{for } k \leq d)$$

with $=$ if and only if \mathcal{E} is a k -design.

Related to ϵ -approximate k -design as

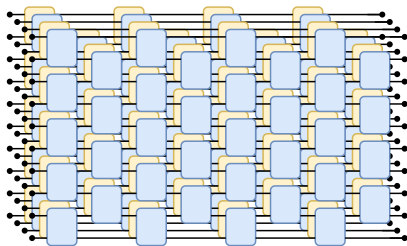
$$\left\| \Phi_{\mathcal{E}}^{(k)} - \Phi_{\text{Haar}}^{(k)} \right\|_{\diamond}^2 \leq d^{2k} \left(\mathcal{F}_{\mathcal{E}}^{(k)} - \mathcal{F}_{\text{Haar}}^{(k)} \right)$$

Frame potential for RQCs

The goal is to compute the FP for RQCs evolved to time t :

$$\mathcal{F}_{\text{RQC}}^{(k)} = \int_{U_t, V_t \in \text{RQC}} dU dV |\text{Tr}(U_t^\dagger V_t)|^{2k}$$

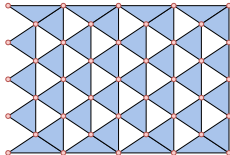
Consider the k -th moments of RQCs, k copies of the circuit and its conjugate:



Lattice mappings for RQCs

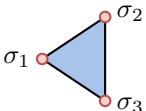
Haar averaging the 2-site unitaries allows us to exactly write the frame potential as a **partition function on a triangular lattice**.

The result is then that we can write the k -th frame potential as

$$\mathcal{F}_{\text{RQC}}^{(k)} = \sum_{\{\sigma\}} \prod_{\triangleleft} J_{\sigma_2\sigma_3}^{\sigma_1} = \sum_{\{\sigma\}}$$


with $\sigma \in S_k$, width $n_g = \lfloor n/2 \rfloor$, depth $2(t-1)$, and pbc in time.

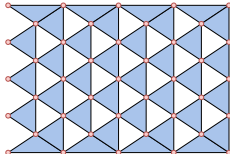
The plaquettes are functions of three $\sigma \in S_k$, written explicitly as

$$J_{\sigma_2\sigma_3}^{\sigma_1} = \sigma_1 \triangleleft \begin{array}{c} \sigma_2 \\ \sigma_3 \end{array} = \sum_{\tau \in S_k} \mathcal{W}g(\sigma_1^{-1}\tau, q^2) q^{\ell(\tau^{-1}\sigma_2)} q^{\ell(\tau^{-1}\sigma_3)} .$$


Lattice mappings for RQCs

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with $\sigma \in S_k$, width $n_g = \lfloor n/2 \rfloor$, depth $2(t-1)$, and pbc in time.

We can show that $J_{\sigma\sigma}^{\sigma} = 1$, and thus the **minimal Haar value** of the frame potential comes from the **$k!$ ground states** of the lattice model

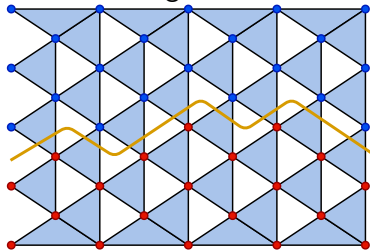
$$\mathcal{F}_{\text{RQC}}^{(k)} = k! + \dots$$

RQC domain walls

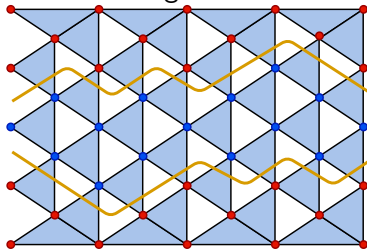
all non-zero contributions to $\mathcal{F}_{\text{RQC}}^{(k)}$ are **domain walls**
(which must wrap the circuit)

e.g. for $k = 2$ we have

a single domain wall
configuration:



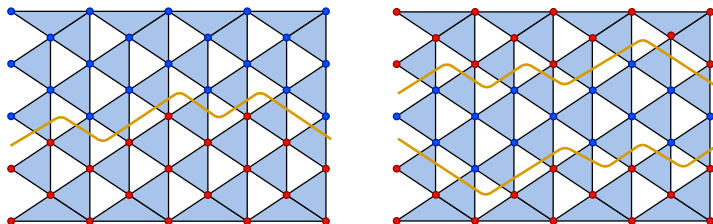
a double domain wall
configuration:



k-designs from domain walls

To compute the k -design time, we simply need to count the domain wall configurations

$$\mathcal{F}_{\text{RQC}}^{(k)} = k! \left(1 + \sum_{1 \text{ dw}} wt(q, t) + \sum_{2 \text{ dw}} wt(q, t) + \dots \right)$$



→ decay to Haar-randomness from dws

RQC 2-design time

We have the $k = 2$ frame potential for random circuits

$$\mathcal{F}_{\text{RQC}}^{(2)} \leq 2 \left(1 + \left(\frac{2q}{q^2 + 1} \right)^{2(t-1)} \right)^{n_g - 1}$$

and recalling that $\|\Phi_{\text{RQC}}^{(2)} - \Phi_{\text{Haar}}^{(2)}\|_{\diamond}^2 \leq d^4 (\mathcal{F}_{\text{RQC}}^{(2)} - \mathcal{F}_{\text{Haar}}^{(2)})$,

the circuit depth at which we form an ϵ -approximate 2-design is then

$$t_2 \geq C(2n \log q + \log n + \log 1/\epsilon) \quad \text{with} \quad C = \left(\log \frac{q^2 + 1}{2q} \right)^{-1}$$

and where for $q = 2$ we have $t_2 \approx 6.2n$, and in the limit $q \rightarrow \infty$ we find $t_2 \approx 2n$

k -designs in RQCs

For general k , we then have the contribution from the **ground states** and **single domain wall sector**, plus higher order contributions

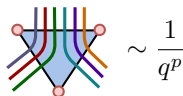
$$\mathcal{F}_{\text{RQC}}^{(k)} \leq k! \left(1 + (n_g - 1) \binom{k}{2} \binom{2(t-1)}{t-1} \left(\frac{q}{q^2 + 1} \right)^{2(t-1)} + \dots \right)$$

k -designs in RQCs

For general k , we then have the contribution from the **ground states** and **single domain wall sector**, plus higher order contributions

$$\mathcal{F}_{\text{RQC}}^{(k)} \leq k! \left(1 + (n_g - 1) \binom{k}{2} \binom{2(t-1)}{t-1} \left(\frac{q}{q^2+1} \right)^{2(t-1)} + \dots \right)$$

Moreover, the **multi-domain wall** terms are heavily suppressed and higher order interactions are subleading in $1/q$ as


$$\sim \frac{1}{q^p}$$

In the large q limit, the **single domain wall sector** gives the ϵ -approximate k -design time: $t_k \geq C(2nk \log q + k \log k + \log(1/\epsilon))$, which is

$$t_k = O(nk)$$

k -designs from stat-mech

RQCs form k -designs in $O(nk)$ depth

we showed this in the large q limit, but this limit is likely not necessary

Conjecture: *The single domain wall sector of the lattice partition function dominates the multi-domain wall sectors for higher moments k and any local dimension q .*

As the lower bound on the design depth is $O(nk)$, RQCs are then **optimal implementations of randomness**

Back to complexity

We'll now end on a much more **speculative** note

If this result holds for G -local random circuits, and for any local dimension q , then the circuits of size $T = O(n^2k)$ form **approx unitary k -designs**

Therefore, G -local RQCs of size T generate at least $M \geq (d/k)^k$ **distinct states** with complexity $\mathcal{C}_\delta(|\psi\rangle) \approx T$. For $k \leq \sqrt{d}$, we have

$$M \gtrsim e^{T \log n}$$

This would then realize a conjecture by [Brown, Susskind] in an explicit example:

the **# of states with $\mathcal{C}_\delta(U_T |\psi_0\rangle) \approx T$** , generated by time-evolution to time T (in this case RQCs of size T), **scales exponentially in T**

Future science

- ▶ Can we **prove** anything about $\mathcal{C}_\delta(e^{-iHt} |\psi\rangle)$ for a fixed Hamiltonian?
- ▶ Can we **rigorously** bound the higher order terms in $\mathcal{F}_{\text{RQC}}^{(k)}$ at small q ? and then extend the result to G -local RQCs
- ▶ Explore the implications of an operational definition of complexity (in terms of a distinguishing measurement). More suited for holography?

Thanks!

(ご清聴ありがとうございました)