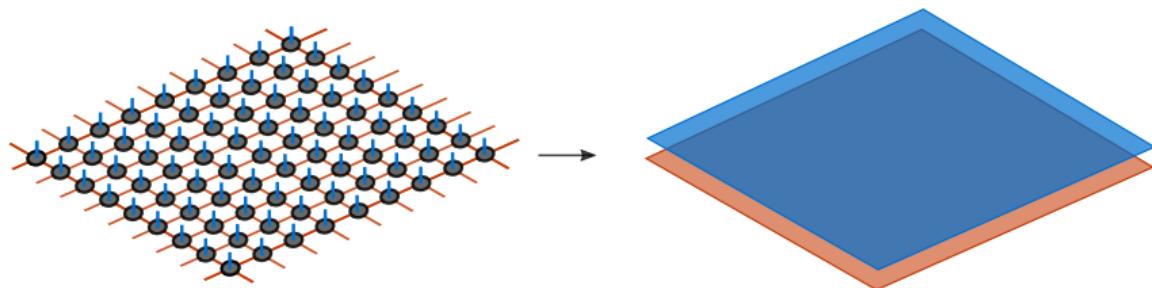


# Continuous tensor network states

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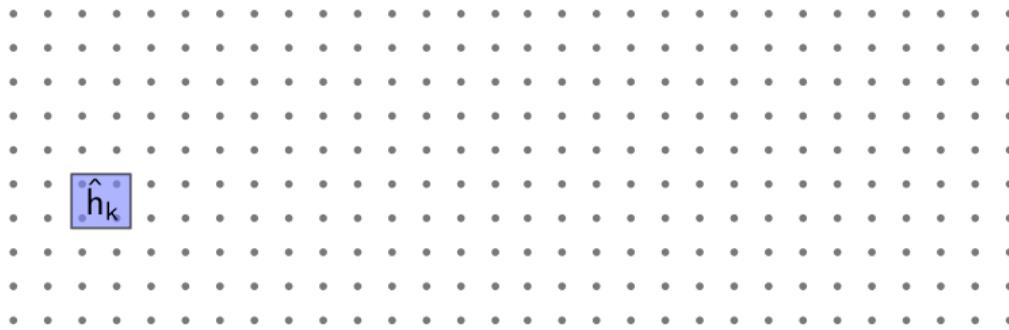
European Tensor Network  
ICCUB School 2021  
October 1st, 2021



PSL

# Quantum many-body problem on the lattice

Typical condensed matter problem:  $|\Psi\rangle = \sum c_{i_1, i_2, \dots, i_N} |i_1, i_2, \dots, i_N\rangle$



## Problem:

Finding the low energy states of

$$\hat{H} = \sum_{k=1}^N \hat{h}_k$$

is **hard** because  $\dim \mathcal{H} \propto 2^N$  for spins

## Possible solutions

- ▶ Perturbation theory but weak coupling
- ▶ Monte Carlo but imprecise and sign problem
- ▶ **Compression**  $2^N \rightarrow N^\alpha$  with controllable error

# The direct compression approach

## Variational method for ground state search

1. Guess a manifold  $\mathcal{M} \subset \mathcal{H}$  with few parameters  $\nu$  i.e.  $\dim \mathcal{M} \ll \dim \mathcal{H}$
2. Tune  $\nu$  to minimize energy  $\nu = \operatorname{argmin}_{\nu \in \mathcal{M}} \frac{\langle \nu | H | \nu \rangle}{\langle \nu | \nu \rangle}$  and get  
 $|\text{ground state}\rangle \simeq |\nu\rangle$

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## Reason for compression (classical)



cat image



“typical” image

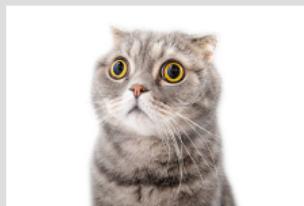
atypical  $\implies$  compressible

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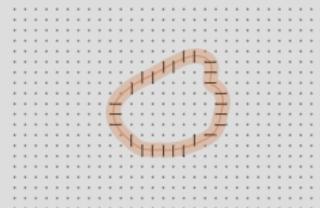
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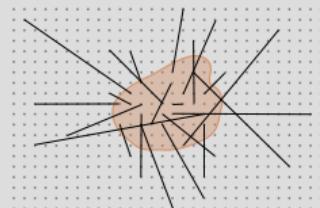
“typical” image

atypical  $\implies$  compressible

## Reason for compression (quantum)



low energy state

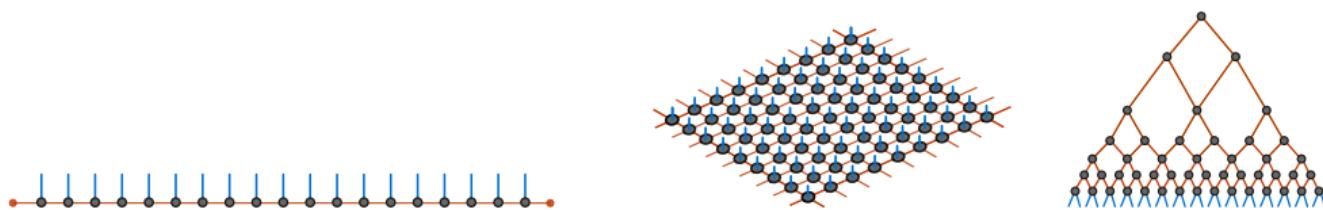


random state

area law = atypical  $\implies$  compressible

# Tensor network states in a nutshell

.zip or .jpg for complex quantum states that appear in Nature

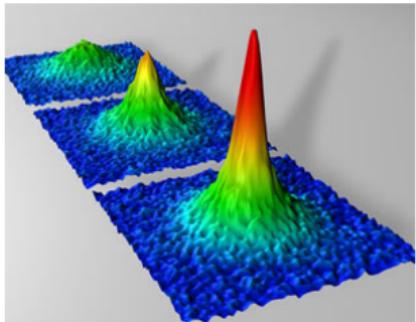


1. **Exponential reduction:**  $2^N \rightarrow N \times D^{2d}$  parameters  
[ $N$  number of spins,  $D$  amount of entanglement,  $d$  space dimension (1, 2, 3)]
2. **Efficient compression:** compression error  $\leq e^{-D}$  or  $1/\text{superpoly}(D)$   
[For a large number of *a priori* non-trivial problems]

# Many non-trivial problems are continuous

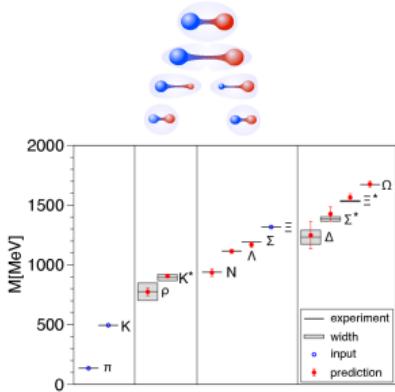
## Non-relativistic QFT

including quantum gases and fractional quantum Hall phases



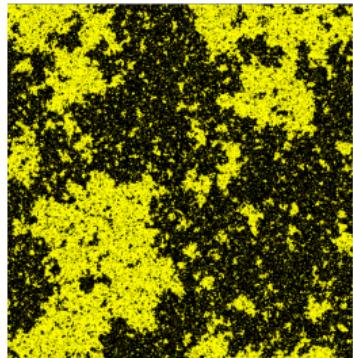
## Relativistic QFT

including, ultimately, quantum chromodynamics



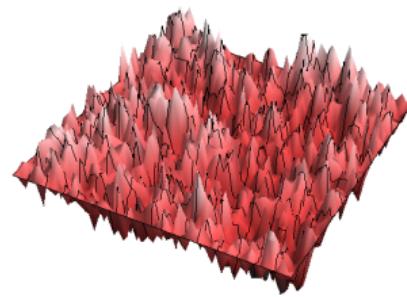
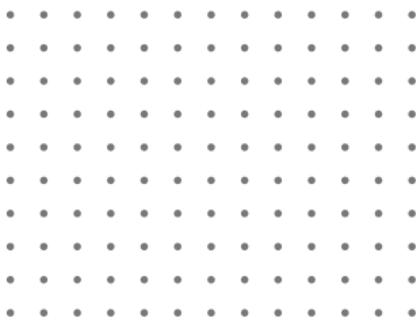
## Critical systems

classical and quantum at 2<sup>nd</sup> order phase transitions



# The quantum many-body problem in the continuum

From the lattice to the continuum and Quantum Field Theory (QFT)



$$|\Psi\rangle = \sum_{i_1, i_2, \dots, i_N} c_{i_1 i_2 \dots i_N} |i_1 i_2 \dots i_N\rangle \quad \longrightarrow \quad |\Psi\rangle = \int \mathcal{D}\phi \psi(\phi) |\phi\rangle$$

**New problem:**  $2^N$   $\mathbb{C}$ -parameters  $\rightarrow \dim \mathcal{H} = \infty^\infty$  even at finite size!

**Question** Can one compress  $\infty^\infty$  down to a manageable number of parameters?  
→ Feynman argued it was impossible in a 1987 conference

# Feynman's criticism

## Difficulties in Applying the Variational Principle to Quantum Field Theories<sup>1</sup>

so I tried to do something along these lines with quantum chromodynamics. So I'm talking on the subject of the application of the variational principle to field theoretic problems, but in particular to quantum chromodynamics.

I'm going to give away what I want to say, which is that I didn't get anywhere! I got very discouraged and I think I can see why the variational principle is not very useful. So I want to take, for the sake of argument, a very strong view – which is stronger than I really believe – and argue that it is no damn good at all!

### Feynman's requirement in a nutshell

#### 1. Extensive parameterization

Number of parameters  $\propto L^\alpha$  at most for system size  $L$

#### 2. Computable expectation values

$\psi$  known  $\implies \langle \mathcal{O}(x)\mathcal{O}(y) \rangle_\psi$  computable

#### 3. Not oversensitive to the UV

no runaway minimization where higher and higher momenta get fitted

# Numerical continuum limit

Change the model so you can apply known methods

## 1. Discretize

**State:**  $|\Psi\rangle = \int \mathcal{D}\phi \psi(\phi) |\phi\rangle \quad \rightarrow \quad |\Psi_\varepsilon\rangle = \sum_{i_1, i_2, \dots, i_N} c_{i_1 i_2 \dots i_N} |i_1 i_2 \dots i_N\rangle$

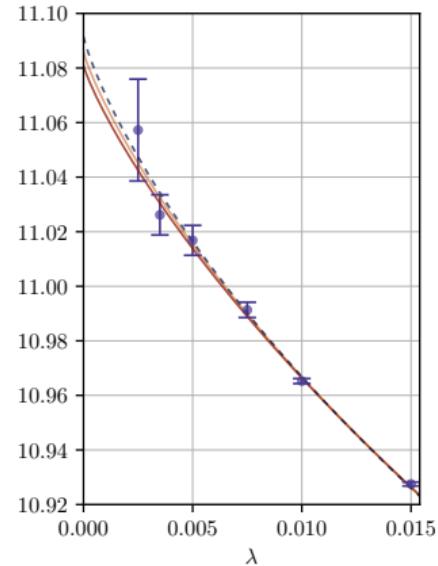
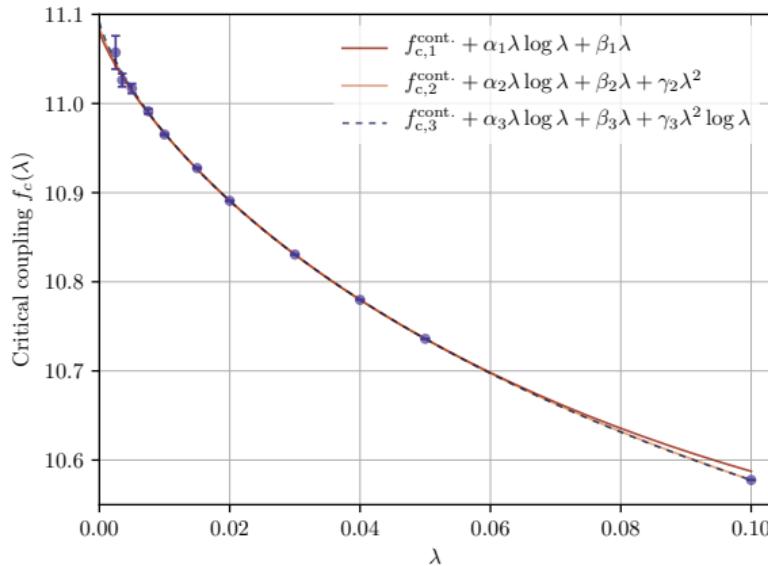
**Hamiltonian:**  $H = \int dx h(x) \quad \rightarrow \quad H_\varepsilon = \sum_i h_i$

## 2. Solve with tensor networks for fixed lattice spacing

## 3. Extrapolate to zero lattice spacing

# Numerical continuum limit

Critical coupling for  $\phi_2^4$  lattice field theory as a function of lattice spacing  $\lambda$

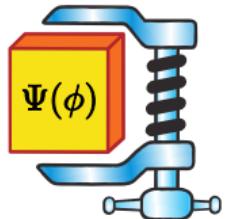


Error grows as  $\lambda \rightarrow 0$

# Working directly in the continuum

## Big challenge

Compress field wavefunctions  $\Psi(\phi)$  and use them to solve the continuous-many-body problem directly



**Status**— since Feynman, breakthrough in 2010 and recent progress

	non-relativistic	relativistic	critical
$d = 1$ space	Verstraete-Cirac 2010	2021	
$d \geq 2$ space	2019		

no idea

heuristics

clear definition

algorithm

# Outline

1. Continuous Matrix Product States  
→ on the board - first half
2. (Relativistic) Continuous Matrix Product States
3. Continuous tensor networks in  $d \geq 2$

# Relativistic continuous matrix product states

**RCMPS**: *A variational ansatz to solve  $1+1d$  relativistic QFT without discretization or cutoff and to arbitrary precision*

# Relativistic continuous matrix product states

**RCMPS**: *A variational ansatz to solve  $1+1d$  relativistic QFT without discretization or cutoff and to arbitrary precision*

## Two papers

- ▶ Variational method in relativistic QFT without cutoff (short)  
arXiv:2102.07733v2
- ▶ Relativistic continuous matrix product states for QFT without cutoff (long)  
arXiv:2102.07741v2

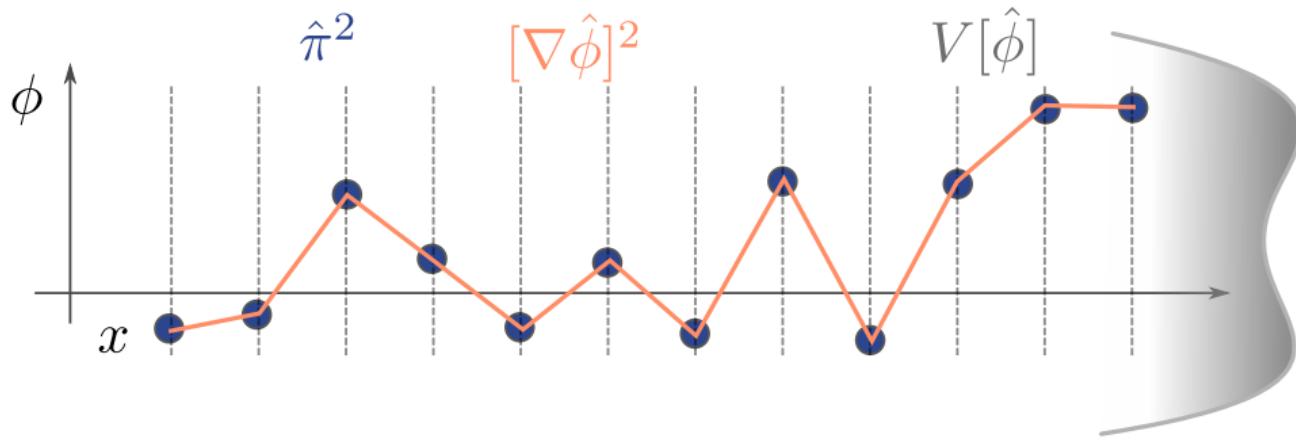
# Outline for relativistic QFT in 1+1

1. Scalar fields in  $1 + 1$  dimensions
2. Variational method in the continuum
3. Relativistic twist  $\psi \rightarrow a$  for CMPS
4. Numerics (and how to achieve  $D^6 \rightarrow D^3$ )
5. Open questions

# Basics of relativistic scalar field theory

from a condensed matter viewpoint

# Intuitive definition: canonical quantization



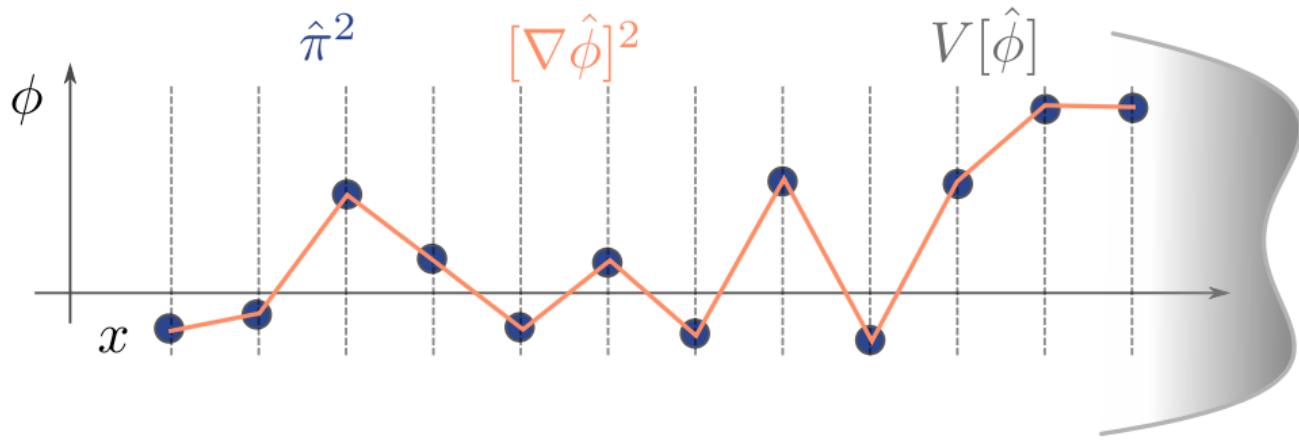
## Hamiltonian

A continuum of nearest neighbor coupled anharmonic oscillators

$$\hat{H} = \int_{\mathbb{R}^d} d^d x \left( \frac{\hat{\pi}(x)^2}{2} \right. \text{on-site inertia} \left. + \frac{[\nabla \hat{\phi}(x)]^2}{2} \right. \text{spatial stiffness} \left. + V(\hat{\phi}(x)) \right. \text{on-site potential}$$

with canonical commutation relations  $[\hat{\phi}(x), \hat{\pi}(y)] = i\delta^d(x - y)\mathbb{1}$  (i.e. bosons)

# Intuitive definition



## Hilbert space

Fock space  $\mathcal{H}_{\text{QFT}} = \mathcal{F}[L^2(\mathbb{R}^d)]$  – just like  $x, p \rightarrow (a, a^\dagger)$  do  $\hat{\pi}, \hat{\phi} \rightarrow \hat{\psi}, \hat{\psi}^\dagger$

$$|\Psi\rangle = \sum_{n=0}^{+\infty} \int dx_1 dx_2 \cdots dx_n \underbrace{\varphi_n(x_1, x_2, \dots, x_n)}_{\text{wave function}} \underbrace{\hat{\psi}^\dagger(x_1) \hat{\psi}^\dagger(x_2) \cdots \hat{\psi}^\dagger(x_n)}_{\text{local oscillator creation}} |\text{vac}\rangle$$

# What are the problems compared to non-relativistic field theories

The Hamiltonian is ill defined on all states in the Hilbert space because of infinite zero point energy *i.e.* terms  $\propto \hat{\Psi}(x)\hat{\Psi}^\dagger(x)$

$$\langle \Psi_1 | \hat{H} | \Psi_2 \rangle = \pm\infty \text{ and even } \langle \text{vac} | \hat{H} | \text{vac} \rangle \propto \delta^d(0) = +\infty$$

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If the divergent vacuum terms are removed, the Hamiltonian is not bounded from below

$$\forall |\Psi\rangle \in \mathcal{H}, \langle \Psi | \hat{H}_{\text{finite}} | \Psi \rangle = \text{finite but } \exists \Psi_n \text{ s.t. } \lim_{n \rightarrow +\infty} \langle \Psi_n | H_{\text{finite}} | \Psi_n \rangle = -\infty$$

# How are they solved in the free case - Hamiltonian

## Bogoliubov transform

Go from  $\hat{\Psi}(x), \hat{\Psi}^\dagger(x)$  to  $a(p), a^\dagger(p)$  with

$$a(p) = \frac{1}{\sqrt{2}} \left( \sqrt{\omega_p} \hat{\phi}(p) + i \frac{\hat{\pi}(p)}{\sqrt{\omega_p}} \right) \quad \text{with} \quad \omega_p = \sqrt{p^2 + m^2}$$

which yields

$$H_0 = \int dp \omega_p \frac{1}{2} (a_p^\dagger a_p + a_p a_p^\dagger)$$

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## Solution

- Take  $H_{\text{QFT}} \equiv :H:$
- $|\text{free ground state}\rangle = |\text{vacuum}\rangle_a$
- $\mathcal{H}$  built from  $a_{p_1}^\dagger \cdots a_{p_n}^\dagger |\text{vacuum}\rangle_a$

This solves the problematic free part exactly, and allows to define a finite interaction (in 1 + 1)

# Example: rigorous operator definition of $\phi_2^4$

## Renormalized $\phi_2^4$ theory

$$H = \int dx \frac{: \pi^2 :_a}{2} + \frac{: (\nabla \phi)^2 :_a}{2} + \frac{m^2}{2} : \phi^2 :_a + g : \phi^4 :_a$$

(note that  $: \diamond :_a$  depends on  $m$ )

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(note that  $:\diamond:_{\text{a}}$  depends on  $m$ )

1. Rigorously defined relativistic QFT without cutoff (Wightman QFT)
2. Vacuum energy density finite
3. Very difficult to solve unless  $g \ll m^2$  (perturbation theory)
4. Phase transition around  $f_c = \frac{g}{4m^2} = 11$  i.e.  $g \simeq 2.7$  in mass units

# Hilbert spaces of RQFT in 1 + 1

Two operator basis

## The $\psi^\dagger(x)$ basis

Local oscillator basis

- + Local in  $\phi, \pi$
- + Natural for discretization
- Divergent and ill-defined

## The $a_k^\dagger$ basis

“Relativistic” oscillator basis

- Non-local
- Less natural for discretization
- + Regular and well-defined

# The variational method

in the continuum

# The variational method

In the Hamiltonian formulation:

- ▶ Guess a **finite dimensional submanifold**  $\mathcal{M}$  of the QFT Hilbert space  $\mathcal{H}$
- ▶ Find the ground state by minimizing  $\langle H \rangle$ :

$$|\text{ground}\rangle \simeq |\psi\rangle = \underset{\mathcal{M}}{\operatorname{argmin}} \frac{\langle \psi | H | \psi \rangle}{\langle \psi | \psi \rangle}$$

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## Example: naive Hamiltonian truncation

With an IR cutoff, momenta are discrete. Take as submanifold  $\mathcal{M}$  the **vector space** spanned by:

$$a_{k_1}^\dagger a_{k_2}^\dagger \cdots a_{k_r}^\dagger |0\rangle_a$$

where  $r \leq r_{\max}$  and  $k \leq k_{\max}$  (one possible truncation)

# Feynman's objection

**Feynman's requirement for variational wavefunctions in RQFT (1987)**

## 1. Extensive parameterization

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All methods so far break one at least:

- ▶ Hamiltonian truncation fails at 1 (but works fairly well through its renormalized refinements)
- ▶ Tensor networks succeed at 1 and 2 but fail (a priori) at 3

# Continuous matrix product states

# Continuous Matrix Product States

Introduced by Verstraete and Cirac in 2010

## Definition

$$|Q, R\rangle = \text{tr} \left[ \mathcal{P} \exp \left\{ \int_0^L dx \ Q \otimes \mathbb{1} + R \otimes \psi^\dagger(x) \right\} \right] |0\rangle_\Psi$$

- ▶  $Q, R$  are  $D \times D$  matrices,
- ▶ The trace is taken over this matrix space
- ▶  $[\psi(x), \psi^\dagger(y)] = \delta(x - y)$
- ▶  $\psi^\dagger(x)$  is non-relativistic creation operator (i.e.  $\phi(x) = \frac{1}{\sqrt{2v}}[\psi(x) + \psi^\dagger(x)]$ )
- ▶  $|0\rangle_\Psi$  is the associated Fock vacuum

## Idea:

- ▶ From MPS: a continuum limit
- ▶ From QFT: a sort of generalized “non-commutative” coherent state

# Computations

Some correlation functions

$$\langle \hat{\psi}(x)^\dagger \hat{\psi}(x) \rangle = \text{Tr} [e^{TL}(R \otimes \bar{R})]$$

$$\langle \hat{\psi}(x)^\dagger \hat{\psi}(0)^\dagger \hat{\psi}(0) \hat{\psi}(x) \rangle = \text{Tr} [e^{T(L-x)}(R \otimes \bar{R}) e^{Tx}(R \otimes \bar{R})]$$

$$\left\langle \hat{\psi}(x)^\dagger \left[ -\frac{d^2}{dx^2} \right] \hat{\psi}(x) \right\rangle = \text{Tr} [e^{TL}([Q, R] \otimes [\bar{Q}, \bar{R}])]$$

with  $T = Q \otimes \mathbb{1} + \mathbb{1} \otimes \bar{Q} + R \otimes \bar{R}$

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## Example

Lieb-Liniger Hamiltonian

$$\mathcal{H} = \int_{-\infty}^{+\infty} dx \left[ \frac{d\hat{\psi}^\dagger}{dx} \frac{d\hat{\psi}}{dx} - \mu \hat{\psi}^\dagger \hat{\psi} + c \hat{\psi}^\dagger \hat{\psi}^\dagger \hat{\psi} \hat{\psi} \right]$$

Solve by **minimizing**:  $\langle Q, R | \mathcal{H} | Q, R \rangle = f(Q, R)$

# State of the art on CMPS

Contrary to common beliefs, CMPS are fairly efficient

1. Fully variational calculations at  $D = 256$  by Ganahl-Rincon-Vidal 2016
2. Recently Tuybens-De Nardis-Haegeman-Verstraete arXiv:2006.01801 included open-boundaries efficiently

# Standard CMPS and relativistic fields

Applying cMPS to e.g. the  $\phi^4$  Hamiltonian

$$\langle Q, R | \hat{h}_{\phi^4} | Q, R \rangle = \infty$$

Oh no!

The short distance behavior of cMPS is the wrong one, even the free theory is hard to approximate.

A possible fix by Haegeman-Cirac-Osborne-Verschelde-Verstraete 2010:

$$H \rightarrow H_\Lambda := H + \frac{1}{\Lambda^2} \int dx \frac{(\partial_x \pi)^2}{2}$$

# Going relativistic

Changing of operator basis

# Towards relativistic CMPS

Local basis in position of the QFT:  $\psi^\dagger, \phi, \pi, |0\rangle_\psi$

Diagonal basis of the free part:  $a_k^\dagger, |0\rangle_a$

## Bogoliubov transform

Go from  $\hat{\psi}(x), \hat{\psi}^\dagger(x)$  to  $a(p), a^\dagger(p)$  with

$$a(p) = \frac{1}{\sqrt{2}} \left( \sqrt{\omega_p} \hat{\phi}(p) + i \frac{\hat{\pi}(p)}{\sqrt{\omega_p}} \right) \quad \text{with} \quad \omega_p = \sqrt{p^2 + m^2}$$

which yields

$$H_0 = \int dp \omega_p \frac{1}{2} (a_p^\dagger a_p + a_p a_p^\dagger)$$

Go from  $|0\rangle_\psi$  to  $|0\rangle_a$

and

Go from  $\psi(x)$  to  $a(x) = \int dp a(p) e^{ipx} \neq \psi(x)$

# Relativistic CMPS

## Definition

$$|R, Q\rangle = \text{tr} \left\{ \mathcal{P} \exp \left[ \int dx Q \otimes \mathbb{1} + R \otimes a^\dagger(x) \right] \right\} |0\rangle_a$$

Some properties

1.  $|0, 0\rangle = |0\rangle_a$  is the ground state of  $H_0$  hence exact CFT UV fixed point (because interaction super-renormalizable)
2.  $\langle Q, R | h_{\phi^4} | Q, R \rangle$  is finite for all  $Q, R$  (not trivial)

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2.  $\langle Q, R | h_{\phi^4} | Q, R \rangle$  is finite for all  $Q, R$  (not trivial)

$a(x)$  is not covariant but the state cannot be exactly Poincaré invariant anyway!

# Consequence on the Hamiltonian

## Hamiltonian density in $a(x)$ basis

$H$  is local in  $\psi(x)$ , not in  $a(x)$ ...

$$\begin{aligned} H = & \int dx_1 dx_2 D(x_1 - x_2) a^\dagger(x_1) a(x_2) \\ & + \int dx_1 dx_2 dx_3 dx_4 K(x_1, x_2, x_3, x_4) a(x_1) a(x_2) a(x_3) a(x_4) + 4a^\dagger a a a + 3a^\dagger a^\dagger a a \\ & + \text{h.c.} \end{aligned}$$

But fortunately exponentially decreasing:  $K$  decays  $\propto e^{-m|x|}$  for  $|x| \gg m$ .

# The variational algorithm

## Procedure:

Compute  $e_0 = \langle Q, R | h_{\phi^4} | Q, R \rangle$  and  $\nabla_{Q, R} e_0$

Minimize  $e_0$  with **TDVP** aka gradient descent with a metric

## Computations of $e_0$ and $\nabla e_0$ in a nutshell:

1. Contains an algebraic part identical to standard cMPS
2. Involves quadruple integrals without analytic solutions

**Initial v1 idea:** compute the integrals with Quadpack  $\rightarrow$  cost  $D^6$

# Computing vertex operators

## Main insight

$\langle :e^{b\phi(x)}:\rangle_{QR}$  computable by solving an ODE with cost  $\propto D^3$

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$\langle :e^{b\phi(x)}: \rangle_{QR}$  computable by solving an ODE with cost  $\propto D^3$

Going from  $\phi(x)$  to  $a(x)$  gives:

$$\begin{aligned}\langle :e^{b\phi(0)}: \rangle_{QR} &= \left\langle \exp \left[ b \int J(x) a^\dagger(x) \right] \exp \left[ b \int J(x) a(x) \right] \right\rangle_{Q,R} \\ &= Z_{bJ, bJ}\end{aligned}\quad (1)$$

with

$$J(x) = \int dk \frac{1}{\sqrt{2\omega_k}} e^{ikx} \quad (2)$$

and  $Z_{j_1, j_2}$  is just the generating functional

$$Z_{j_1, j_2} = \text{tr} \left[ \mathcal{P} \exp \int \mathbb{T} + j_1(x) R \otimes \mathbb{1} + j_2(x) \mathbb{1} \otimes \bar{R} dx \right] \quad (3)$$

## Algorithm v2 $\propto D^3$

1. Compute  $Z_{bJ, bJ}$  by solving the ODE

$$\partial_x \rho = \mathcal{L} \rho + bJ(x)(R\rho + \rho R^\dagger)$$

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### Bottom line

Solve with cost  $\propto D^3$  all theories with  $V(\phi)$  poly :  $\phi^n$  : or exponential :  $e^{b\phi}$  : (including Sine/Sinh-Gordon and thus Fermionic theories via bosonization)

# Scaling comparison with renormalized Hamiltonian truncation

## Ren. Hamiltonian truncation

IR cutoff  $L$ , energy truncation  $E_T$

- ▶ Uses a vector space
- ▶ Function to minimize is quadratic, hence linear problem
- ▶ Number of parameters  $\propto e^{L \times E_T}$
- ▶ Error  $\propto 1/E_T^3$

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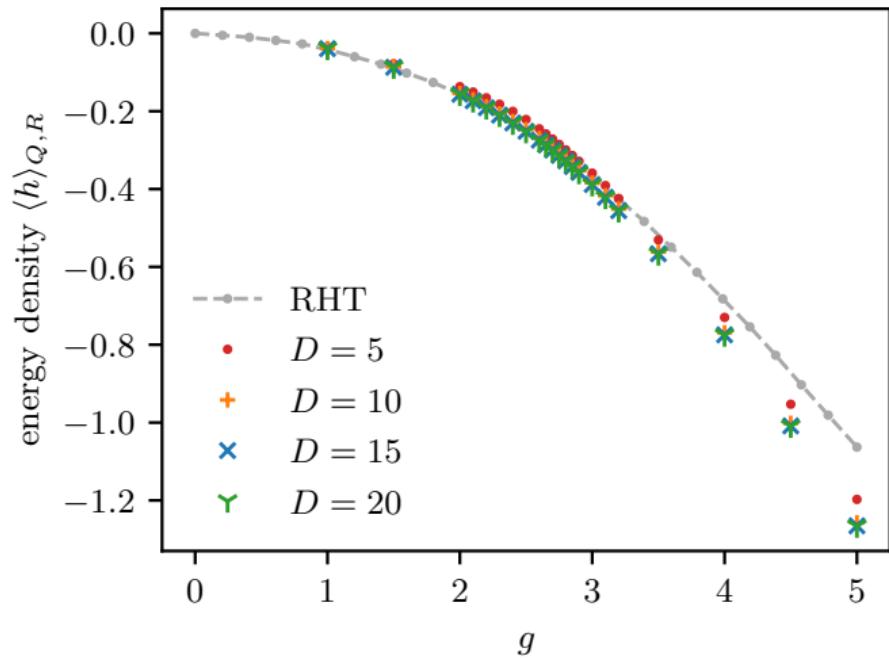
## Relativistic CMPS

entanglement truncation  $D$

- ▶ Uses a manifold
- ▶ Minimization is a priori non-trivial but doable
- ▶ Number of parameters  $\propto D^2$
- ▶ Error  $\mathcal{O}(1/D^\alpha)$ ,  $\forall \alpha$  (folklore)

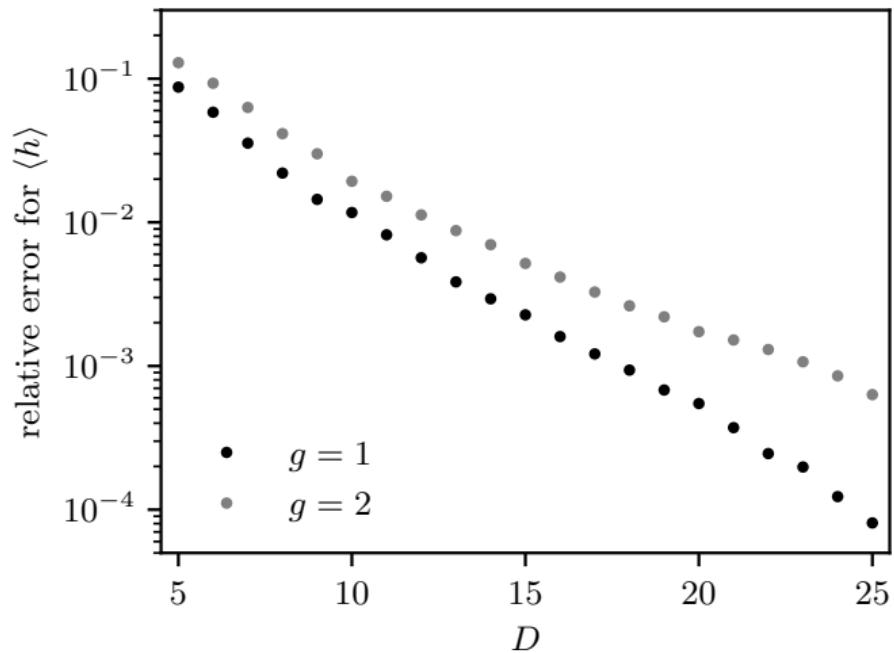
# Results

## Energy density



# Results

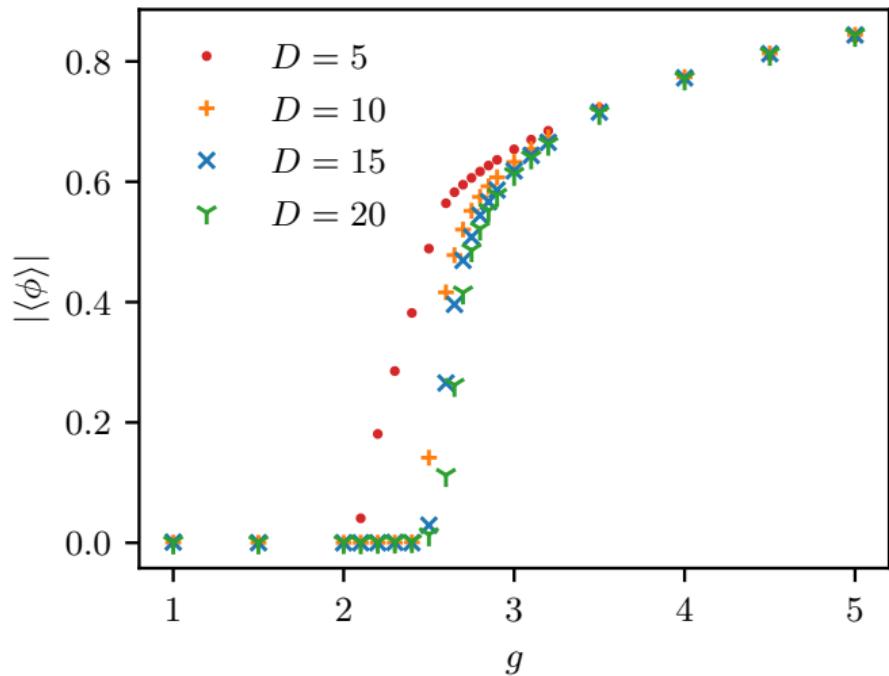
## Error in energy density



Approximately exact value extrapolated from  $D = 32$  (bootstrapped error  $< 10^{-4}$ ). More precise than high precision RHT. Pushable to  $D > 40$

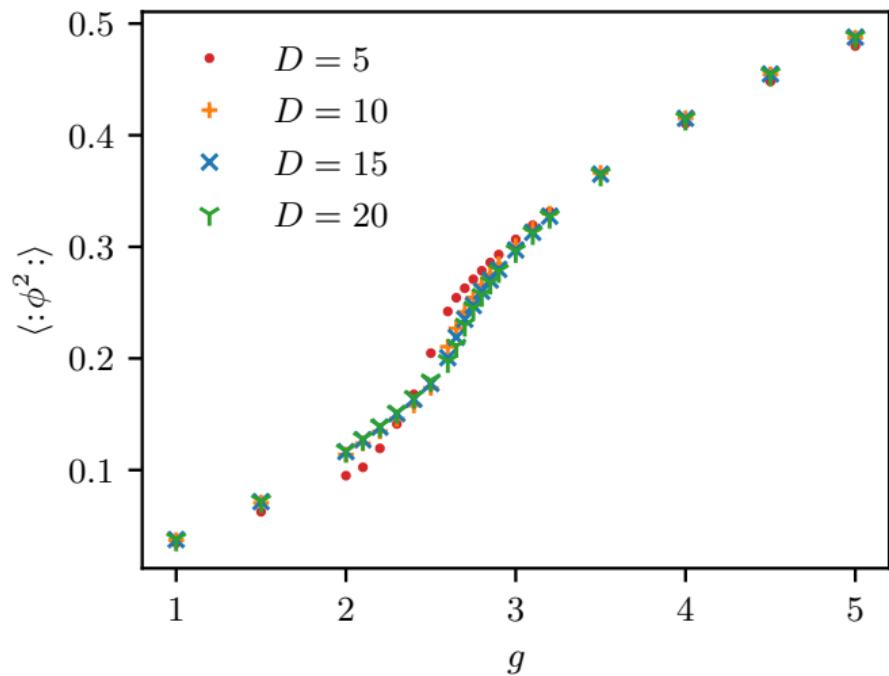
# Results

Magnetization  $\langle \phi \rangle$



# Results

$$\langle :\phi^2:\rangle$$



# Open problems and perspectives

# New entanglement entropy

## Conjecture

For the notion of space locality is induced by  $a^\dagger(x), a(x)$  (instead of usual  $\phi(x)$ ), gapped QFT ground states verify the area law with a **finite** prefactor.

- ▶ This entanglement entropy is weird from a relativistic point of view
- ▶ But captures the notion of approximability with tensor network states

Useful notion? Can the conjecture be proved?

## More general short distance behavior

RCMPS have the short distance behavior of a free CFT (fairly generic in HEP)

Can one deal with relevant perturbations of other UV CFTs (e.g. Ising)?

Equivalent of  $a(x)$ ? Coulomb gas construction?

# Higher dimensions

## RQFT difficulty

Normal ordering / tadpole cancellation no longer sufficient

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## (non-relativistic) Tensor network difficulty

Continuous tensor network states less developed in  $2+1$

1. Proposal with Ignacio Cirac:  $R, Q$  promoted to fields, needed to preserve Euclidean invariance
2. Successfully tested on Gaussian problems with Teresa Karanikolaou (also independently in Ghent by Bastiaan Aelbrecht)
3. Need to solve a boundary  $1+1$  RQFT to compute more general expectation values

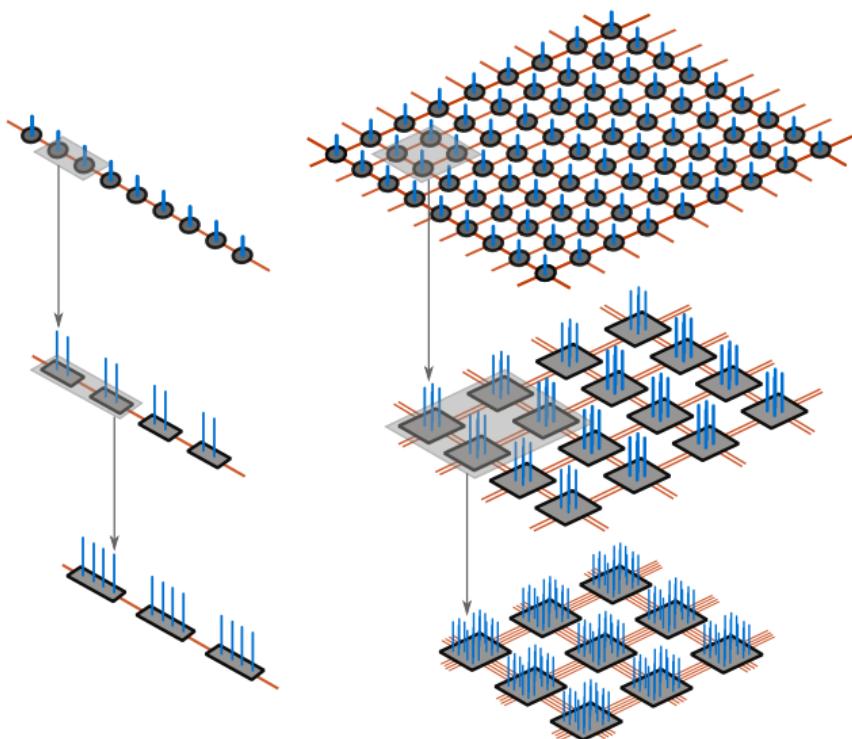
Non-relativistic  $2+1$  now seems feasible thanks to RCMPS...

# Summary of relativistic CMPS

1. Ansatz for  $1+1$  relativistic QFT
2. No cutoff, UV or IR
3. UV is captured exactly even at  $D = 0$
4. Efficient (cost poly  $D$ , error at most superpoly  $1/D$ ) and now competitive
5. Rigorous (variational)

What about  $d \geq 2$

# Continuous Tensor Networks: blocking

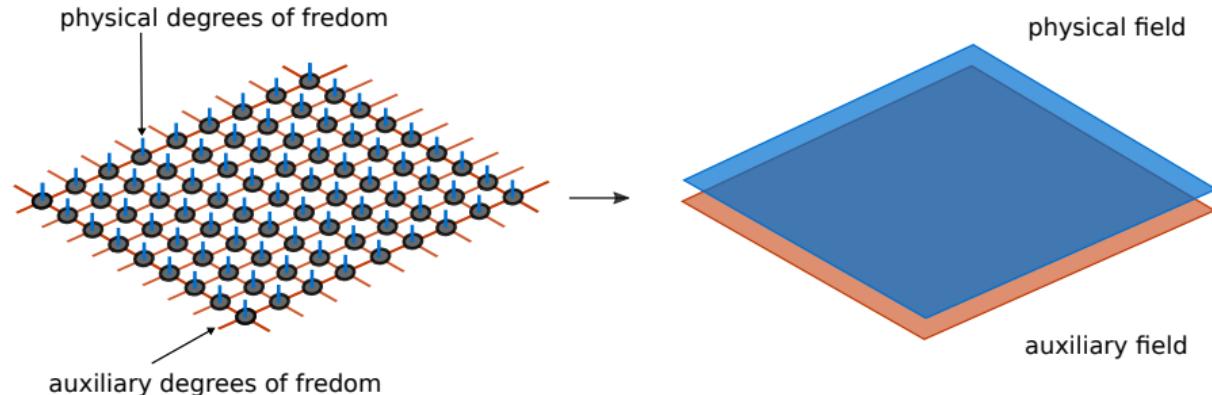


### Upon blocking:

- ◊ The **physical** Hilbert space dimension increases
- ◊ The **bond** (auxiliary space) dimension  $D$  increases too

Now from bottom to top, fine graining will yield zero bond dimension.

# Result



AT, J. I. Cirac, 2019

## Continuous tensor network state (heuristically)

State  $|V, \alpha\rangle$  of  $d + 1$  QFT from an auxiliary  $d$  dimensional theory of random fields  $\phi$ :

$$|V, \alpha\rangle = \int \mathcal{D}\phi \exp \left\{ - \int d^d x \mathcal{L}_V[\phi(x)] - \alpha[\phi(x)] \hat{\psi}^\dagger(x)_{\text{creation}} \right\} |\Omega\rangle$$

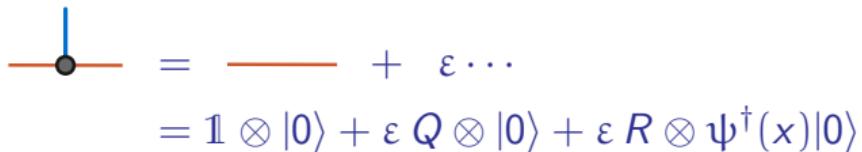
# Choice of tensor around which to expand...

For **MPS**, not much choice:


$$\begin{aligned} &= \text{---} + \varepsilon \dots \\ &= \mathbb{1} \otimes |0\rangle + \varepsilon Q \otimes |0\rangle + \varepsilon R \otimes \psi^\dagger(x)|0\rangle \end{aligned}$$

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For **TNS** in  $d \geq 2$ , many options:

1. Take a  $\delta$  between all legs  $\sim$  GHZ state  $T^{(0)} = \cancel{\text{---}}$   
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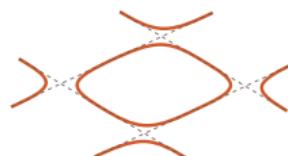
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2. Take two identities  $T^{(0)} = \text{---} \times \text{---}$   
 $\implies$  breakdown of Euclidean invariance
3. Take the sum of pairs of identities in both directions  
 $T^{(0)} = \text{---} \times \text{---} + \text{---} \times \text{---}$



# Ansatz

1 – Take a “Trivial” tensor:

$$T_{\phi(1), \phi(2), \phi(3), \phi(4)}^{(0)} = \begin{array}{c} \phi(2) \quad \phi(3) \\ \diagup \quad \diagdown \\ \phi(1) \quad \phi(4) \end{array}$$
$$\sim \exp \left\{ \frac{-1}{2} \sum_{k=1}^D [\phi_k(1) - \phi_k(2)]^2 + [\phi_k(2) - \phi_k(3)]^2 \right. \\ \left. + [\phi_k(3) - \phi_k(4)]^2 + [\phi_k(4) - \phi_k(1)]^2 \right\}$$

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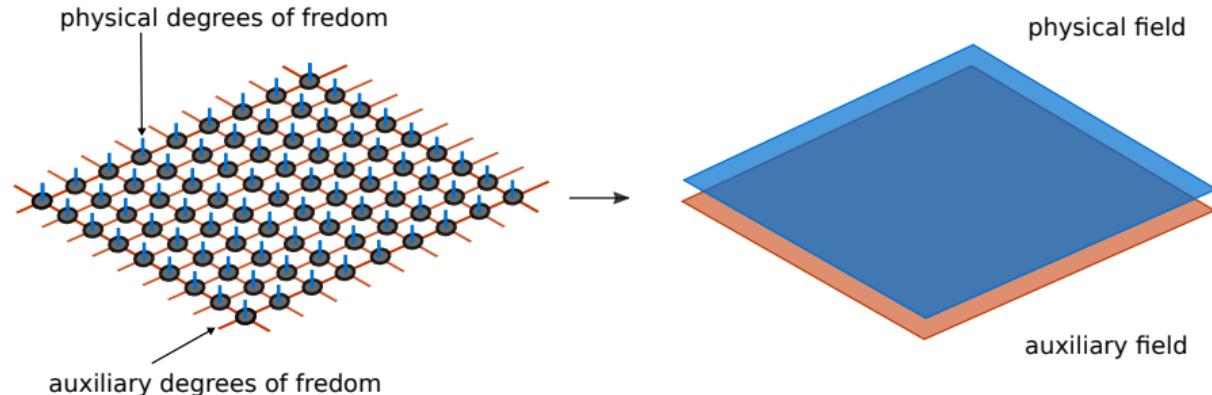
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3 – Realize tensor contraction = functional integral and trivial tensor gives free field measure.

# Result



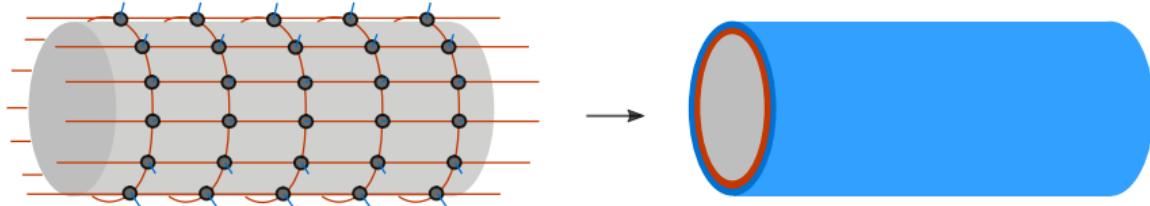
AT, J. I. Cirac, 2019

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# Operator definition



$|V, \alpha\rangle =$

$$\text{tr} \left[ \mathcal{T} \exp \left( - \int_0^T d\tau \int_S dx \frac{\hat{\pi}_k(x) \hat{\pi}_k(x)}{2} + \frac{\nabla \hat{\phi}_k(x) \nabla \hat{\phi}_k(x)}{2} + V[\hat{\phi}(x)] - \alpha[\hat{\phi}(x)] \psi^\dagger(\tau, x) \right) \right]$$

where:

- $\hat{\phi}_k(x)$  and  $\hat{\pi}_k(x)$  are  $D$  independent canonically conjugated pairs of (auxiliary) field operators:  $[\hat{\phi}_k(x), \hat{\phi}_l(y)] = 0$ ,  $[\hat{\pi}_k(x), \hat{\pi}_l(y)] = 0$ , and  $[\hat{\phi}_k(x), \hat{\pi}_l(y)] = i\delta_{k,l} \delta(x - y)$  acting on a space of  $d - 1$  dimensions.

# Wave-function definition

A generic state  $|\Psi\rangle$  in Fock space can be written:

$$|\Psi\rangle = \sum_{n=0}^{+\infty} \int_{\Omega^n} \frac{\varphi_n(x_1, \dots, x_n)}{n!} \psi^\dagger(x_1) \dots \psi^\dagger(x_n) |0\rangle$$

where  $\varphi_n$  is a symmetric  $n$ -particle wave-function

## Functional integral representation

$$\varphi_n(x_1, \dots, x_n) = \langle \alpha[\phi(x_1)] \dots \alpha[\phi(x_n)] \rangle_{\text{aux}}$$

with:

$$\langle \cdot \rangle_{\text{aux}} = \int \mathcal{D}\phi \cdot B(\phi|_{\partial\Omega}) \exp \left[ -\frac{1}{2} \int_{\Omega} d^d x [\nabla \phi_k(x)]^2 + V[\phi(x)] \right]$$

- $\sim$  Ansatz wave-function for Quantum Hall, but CFT  $\rightarrow$  QFT

# Expressivity and stability

How big are cTNS?

## Stability

The sum of two cTNS of bond field dimension  $D_1$  and  $D_2$  is a cTNS with bond field dimension  $D \leq D_1 + D_2 + 1$ :

$$|V_1, \alpha_1\rangle + |V_2, \alpha_2\rangle = |W, \beta\rangle$$

## Expressiveness

All states in the Fock space can be approximated by cTNS:

- ▶ A field coherent state is a cTNS with  $D = 1$
- ▶ Stability allows to get all sums of field coherent states

# Computations

Define generating functional for normal ordered correlation functions

$$\mathcal{Z}_{j',j} = \frac{1}{\langle V, \alpha | V, \alpha \rangle} \langle V, \alpha | \exp \left( \int dx j'(x) \psi^\dagger(x) \right) \exp \left( \int dx j(x) \psi(x) \right) | V, \alpha \rangle$$

## Operator representation

$$\mathcal{Z}_{j',j} = \text{tr} \left[ B \otimes B^* \mathcal{T} \exp \left\{ \int_{-T/2}^{T/2} \left( T_{j',j} - \int_S j \cdot j' \right) \right\} \right]$$

with **transfer matrix**:

$$T_{j',j} = \int_S dx \mathcal{H}(x) \otimes \mathbb{1} + \mathbb{1} \otimes \mathcal{H}^*(x) + \left( \alpha[\hat{\phi}(x)] + j'(x) \right) \otimes \left( \alpha[\hat{\phi}(x)]^* + j(x) \right)$$

$$\text{and } \mathcal{H}(x) = \sum_{k=1}^D \frac{[\hat{\pi}_k(x)]^2 + [\nabla \hat{\phi}_k(x)]^2}{2} + V[\hat{\phi}(x)]$$

⇒ cMPS brought us from 1 to 0, cTNS bring us from  $d$  to  $d-1$ .

# Contraction

- ▶ In general, need boundary relativistic CMPS to contract
- ▶ If  $V(\phi) = V^{(0)}\phi_i V_{ij}^{(2)}\phi_j$   
and  $\alpha(\phi) = \alpha^{(0)} + \alpha_i^{(1)}\phi_i$   
Gaussian  $\rightarrow$  exactly contractible

Example:

$$H = \int \nabla \hat{\psi}^\dagger \nabla \hat{\psi} + \mu \psi^\dagger \hat{\psi} - \lambda (\hat{\psi}^\dagger \hat{\psi}^\dagger + \hat{\psi} \hat{\psi})$$

# Gaussian example

Work done by Teresa Karanikolaou with help from Patrick Emonts (PRR 2021)

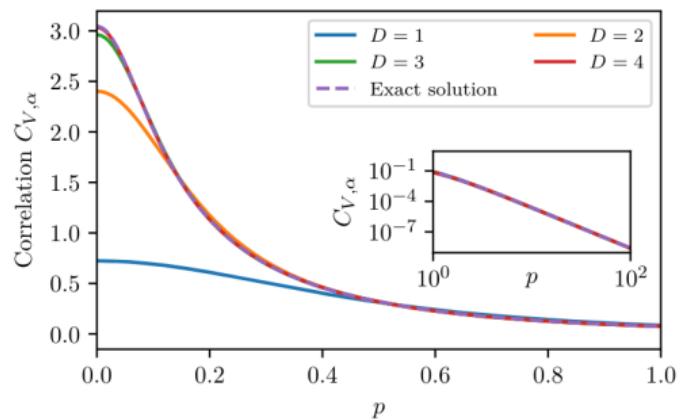
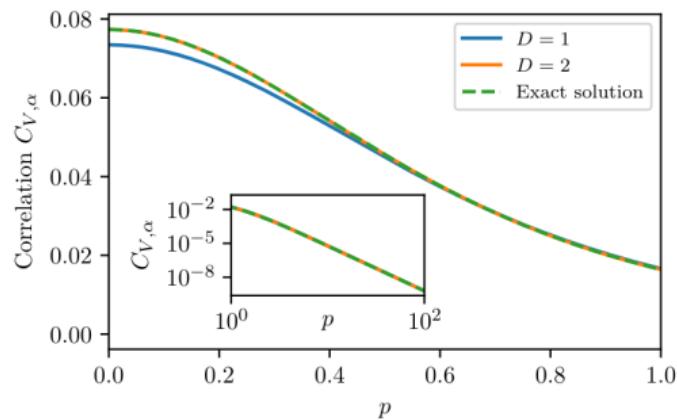
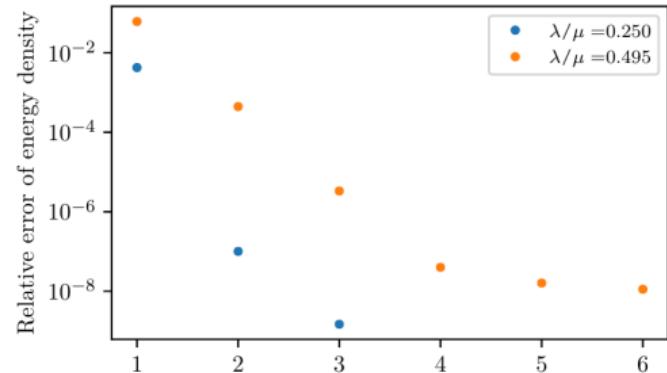
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in  $d = 2$  energy density  $\langle h \rangle$  divergent, but CTNS also divergent!

$$\langle h \rangle = e_0^r + \log(\Lambda) e_0^\infty \quad (4)$$

1. Analytically minimize the divergent part
2. Numerically minimize the remain finite (renormalized part)

# Energy and correlation functions



# Summary of CTNS

$$|V, B, \alpha\rangle = \int \mathcal{D}\phi \exp \left\{ - \int_{\Omega} d^d x \frac{1}{2} \sum_{k=1}^D [\nabla \phi_k(x)]^2 + V[\phi(x)] - \alpha[\phi(x)] \psi^\dagger(x) \right\} |0\rangle$$

Continuous tensor network states are natural continuum limits of tensor network states and natural higher  $d$  extensions of continuous matrix product states.

1. Obtained from discrete tensor networks
2. Can be made Euclidean invariant
3. **Motto of tensor networks:** trade a dimension for a variational optimization
4. Still needs to be used to approximate non-trivial non-Gaussian ground states

