

# Continuous tensor networks in $d \geq 1$

## possible approaches

Antoine Tilloy

Max Planck Institute of Quantum Optics, Garching, Germany

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## Why go to continuous TN

- ▶ Discrete TNs in  $d \geq 2$  are hard to contract

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- ▶ Discrete TNs in  $d \geq 2$  are hard to contract
- ▶ Model QFTs **directly**
- ▶ Why not?

# Matrix product states

Definition of a MPS:

$$|A\rangle = \sum_{i_1, i_2, \dots, i_n} \langle L | A_{i_1} A_{i_2} \cdots A_{i_n} | R \rangle |i_1, \dots, i_n\rangle$$



# Matrix product states

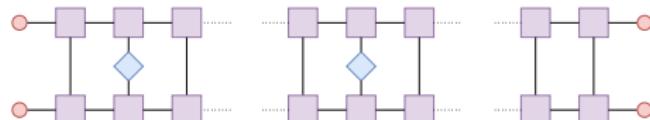
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Operator expectation values:

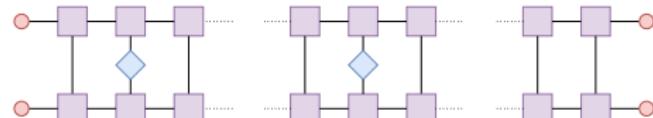
$$\langle A | \mathcal{O}(\ell_1) \mathcal{O}(\ell_2) | A \rangle =$$



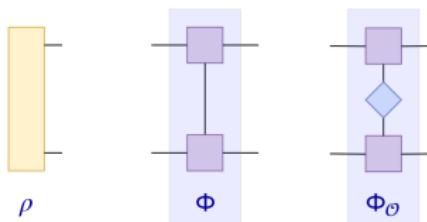
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Evolution picture

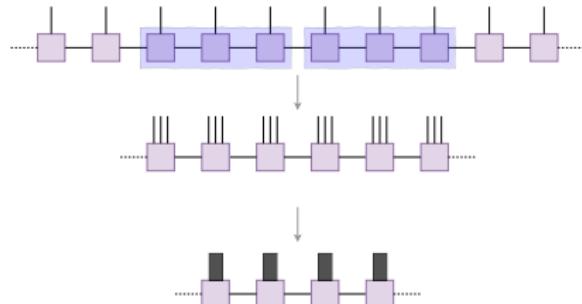


$$\langle A | \mathcal{O}(\ell_1) \mathcal{O}(\ell_2) | A \rangle = \text{tr} \left[ \rho_R \Phi^{n_1} \cdot \Phi_{\mathcal{O}} \cdot \Phi^{n_2} \cdot \Phi_{\mathcal{O}} \cdot \Phi^{n_3} \rho_L \right]$$

$A$  can be seen as prescribing **dynamics** (or laws) rather than as a **state**

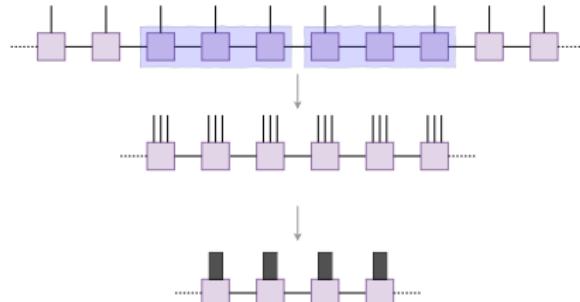
# From MPS to cMPS

Zooming out



# From MPS to cMPS

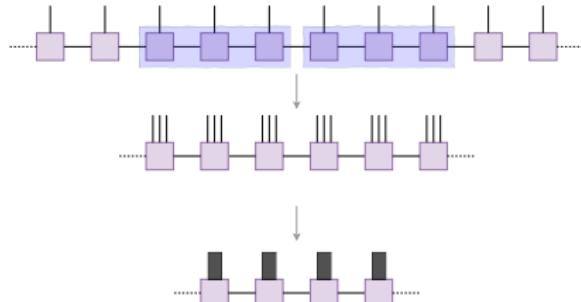
## Zooming out



- ▶ the bond dimension stays fixed
- ▶ the physical dimension explodes  $\mathbb{C}^2 \otimes \cdots \otimes \mathbb{C}^2 \longrightarrow \mathcal{F}(L^2([x, x + dx]))$ .

# From MPS to cMPS

## Zooming out



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- ▶ the physical dimension explodes  $\mathbb{C}^2 \otimes \cdots \otimes \mathbb{C}^2 \longrightarrow \mathcal{F}(L^2([x, x + dx]))$ .  
     $\implies$  **Spins** become **fields**.
- ▶ a cMPS aims at describing  in continuous space

# cMPS

## Type of ansatz

- Matrices  $A_{i_k}(x)$  where the index  $i_k$  corresponds to  $a^{\dagger i_k}(x)|0\rangle$  in physical space.

### Informal cMPS definition

$$A_0 = \mathbb{1} + \varepsilon Q$$

$$A_1 = \varepsilon R$$

$$A_2 = \frac{(\varepsilon R)^2}{\sqrt{2}}$$

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so we go from  $\infty$  to 2 matrices

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- Finite particle number

$$\begin{matrix} 0 & 0 & 0 & 0 & 0 & 0 \\ \square & \square & \square & \square & \square & \square \end{matrix} \propto 1$$

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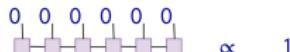
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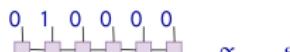
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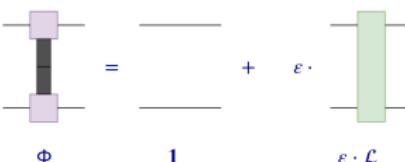
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- Non trivial map



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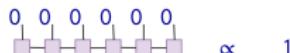
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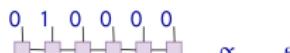
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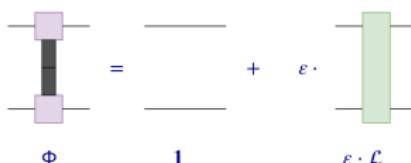
so we go from  $\infty$  to 2 matrices

- Finite particle number


$$0 \ 0 \ 0 \ 0 \ 0 \ 0 \propto 1$$


$$0 \ 1 \ 0 \ 0 \ 0 \ 0 \propto \varepsilon$$

- Non trivial map


$$\Phi = \mathbb{1} + \varepsilon \cdot \mathcal{L}$$

- Consistency


$$1 \ 1 \simeq 2 \ 0$$

# cMPS

## Formal cMPS definition

$$|Q, R\rangle = \langle \omega_L | \mathcal{P} \exp \left\{ \int_0^L dx \ Q \otimes \mathbb{1} + R \otimes a^\dagger(x) \right\} | \omega_R \rangle |0\rangle$$

Idea:

$$\begin{aligned} A(x) &\simeq A_0 \mathbb{1} + A_1 a^\dagger(x) \\ &\simeq \mathbb{1} \otimes \mathbb{1} + \varepsilon Q \otimes \mathbb{1} + \varepsilon R \otimes a^\dagger(x) \\ &\simeq \exp \left[ \varepsilon \left( Q \otimes \mathbb{1} + R \otimes a^\dagger(x) \right) \right] \end{aligned}$$

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## Equivalent cMPS definition

$$|K, R\rangle = \langle \omega_L | \mathcal{P} \exp \left\{ -i \int_0^L dx \ K \otimes \mathbb{1} + iR \otimes a^\dagger(x) - iR^\dagger a(x) \right\} | \omega_R \rangle |0\rangle$$

with  $iK = Q + \frac{1}{2}R^\dagger R$ .

## Field wave function

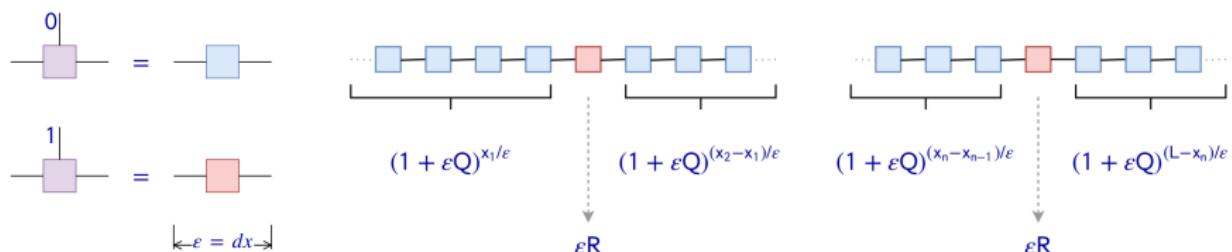
$$|\Psi\rangle = \sum_{n=0}^{+\infty} \int_{[0, L]^n} dx_1 \cdots dx_n \psi_n(x_1, \dots, x_n) a^\dagger(x_1) \cdots a^\dagger(x_n) |0\rangle$$

cMPS

## Field wave function

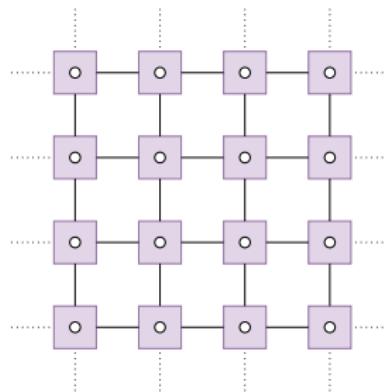
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## Field wave function for the cMPS

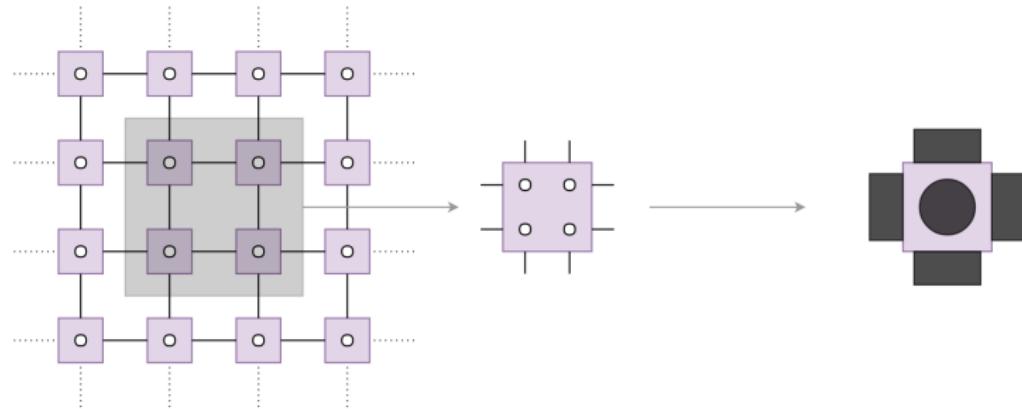


$$\psi_n(x_1, \dots, x_n) dx_1 \cdots dx_n = e^{x_1 Q} \textcolor{red}{R} e^{(x_2 - x_1) Q} \cdots e^{(x_n - x_{n-1}) Q} \textcolor{red}{R} e^{(L - x_n) Q} \underbrace{\varepsilon \cdot \varepsilon \cdots \varepsilon}_{dx_1 \cdots dx_n}$$

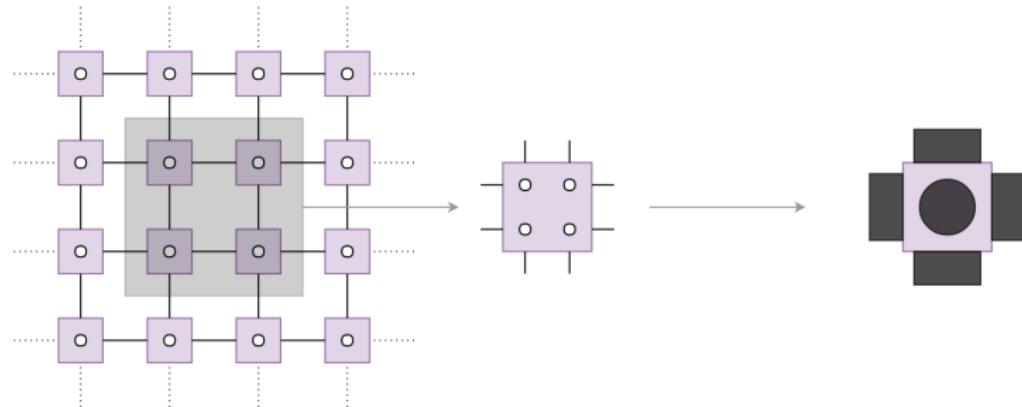
# Tensor networks in 2d



## Zooming out



## Zooming out



- ▶ The physical dimension becomes infinite
- ▶ **The bond dimension becomes infinite**

Do we need an ansatz with a field theory on the virtual space?

# iMPS



Take  $A_i(x_i)$  an operator of a QFT

Naive example:  $\hat{\Psi}_{0,1}$  is a spin  $1/2$  field,  $A_i(x_i) = \hat{\Psi}_i(x_i)$

$$|iMPS\rangle = \sum_{i_1, \dots, i_n} \langle 0 | \hat{\Psi}_{i_1}(x_1) \dots \hat{\Psi}_{i_n}(x_n) | 0 \rangle |i_1, \dots, i_n\rangle$$

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- ▶ wave function of something = correlation function of something else
- ▶ typically  $A_i(x_i)$  a vertex operator of a CFT
- ▶ not dense in field states but analytic

## More traditional/naive continuous TNs

A **continuous TN** is an object that takes a (discrete) bunch of (discrete) tensors and spits a field state:

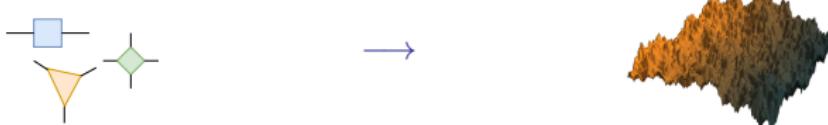
$$|A, B, \dots \rangle = \sum \psi(x_1, \dots, x_n) a^\dagger(x_1) \dots a^\dagger(x_n) |0\rangle$$



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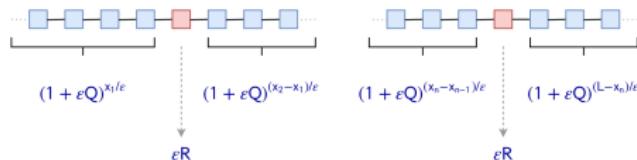


- ▶ **dense** in field states
- ▶ not **too** abstract
- ▶ maybe not in **1 to 1** with the discrete

# A few options

Get inspiration from **cMPS**:

1. Extending the “wave function” picture  $\rightarrow$  **random curves**



2. Extending the  $\mathcal{P}$ -ordered product  $\rightarrow$  **path integral**

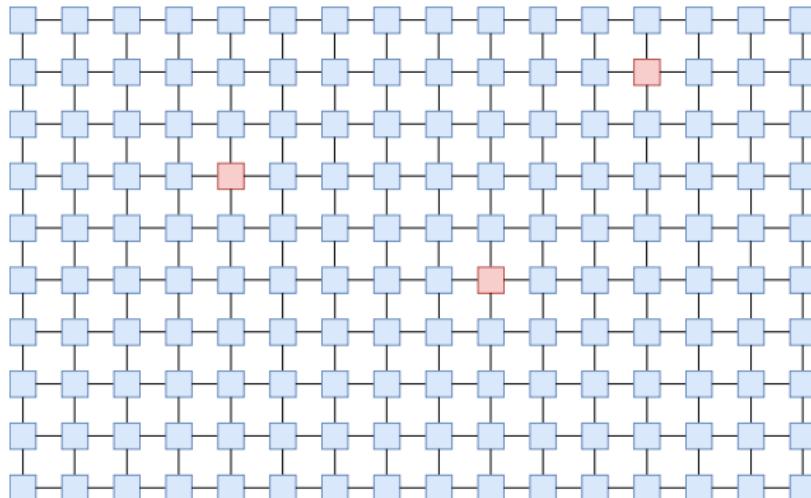
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## “Wave function” picture

For cMPS:



For cPEPS:

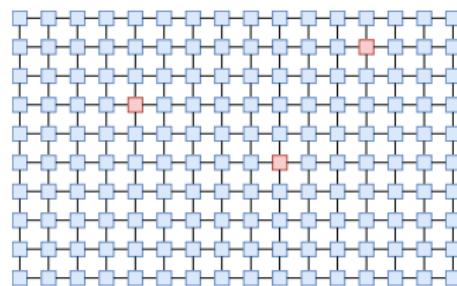


with  $a^\dagger(x_i)$  and  $\mathbb{1}$  on the physical space

## “Wave function” picture

Take as the **ansatz**:

$$\text{---} \square \text{---} = \text{---} \circlearrowleft \text{---} + \text{---} \circlearrowright \text{---}$$



$$\rightarrow \sum \text{---} \circlearrowleft \text{---} \circlearrowright \text{---} \circlearrowleft \text{---} \circlearrowright \text{---}$$

⇒ Sum on self-avoiding loops with defects

## “Wave function” picture

Along a line, just a product of matrices  $\sim \exp(\ell \hat{Q})$

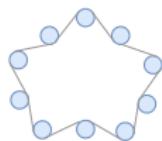


## “Wave function” picture

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Along a closed loop without defect, a trace  $\sim \text{tr}[\exp(\ell \hat{Q})]$



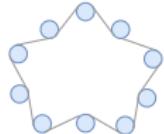
Take  $\hat{Q} = i\hat{H}$ , s.t.  $\text{tr}[\exp(\ell \hat{Q})] = 1$  to remove the contribution of loops without defects

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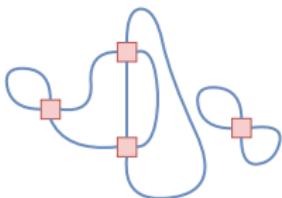


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Finally, the **wave function** reads as a sum of:



Each line of length  $\ell$  represents the matrix  $\exp[\ell \hat{Q}]$

## Continuum limit and generalization

A few difficulties still:

- ▶ Self avoiding loops are not trivial to manage
- ▶ Model not manifestly isotropic

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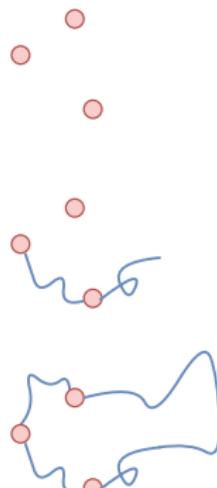
## Tentative cTN definition

### Main objects:

- ▶ A self-adjoint matrix  $H$
- ▶ A fully symmetric  $n$ -tensor  $T$
- ▶ A family of random curves  $\mathcal{C}$  with Euclidean invariant probability distribution  $d\mu(\mathcal{C})$

### Construction:

- ▶ Propagate a curve until nodes  $T$  are hit  $n$  times
- ▶ Contract the network, with each line  $e^{i\ell H}$
- ▶ Sum  $\int_{\mathcal{C}} \cdot d\mu(\mathcal{C})$



## Comments

- ▶ A cTN is the limit of a TN only in  $d = 1$
- ▶ The connectivity of the graph is unrelated to the dimension



- ▶ In  $2d$ , lots of nice random curves: Brownian motion, SLE...
- ▶ Provides a natural deformation of conformal field theories
- ▶ Of course, very non-explicit so far

## back to cMPS

Operator definition:

$$|K, R\rangle = \langle \omega_L | \mathcal{P} \exp \left\{ -i \int_0^L dx \ K \otimes \mathbb{1} + iR \otimes a^\dagger(x) - iR^\dagger a(x) \right\} | \omega_R \rangle |0\rangle$$

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## Path integral representation of cMPS

$$|K, R\rangle = \int \mathcal{D}[\phi] e^{-S_{\text{kinetic}}(\phi, \phi^*)} \exp \left\{ -i \int_0^L \phi_x^\dagger K \phi_x \mathbb{1} + i \phi_x^\dagger R \phi_x a^\dagger(x) - i \phi_x^\dagger R^\dagger \phi_x a(x) \right\} |0\rangle$$

with the Euclidean action:

$$S_{\text{kinetic}}(\phi, \phi^*) = i \int_0^L \phi_x^\dagger \partial_x \phi_x$$

Equivalently:

$$|K, R\rangle = \int \underset{\text{measure}}{d\mu(\phi)} \underset{\text{phase}}{e^{-i \int_0^L \phi_x^\dagger K \phi_x}} \underset{\text{coherent state}}{|\phi^\dagger R \phi\rangle}$$

## Path integral in $d \geq 2$

### Path integral definition of cTN

Basic objects:

- $n$  random fields  $\phi_i$  with Euclidean invariant probability
- a self-adjoint  $n \times n$  “phase” matrix  $K$
- a generic  $n \times n$  “coherent amplitude” matrix  $R$

Construction:

$$|K, R\rangle = \mathbb{E}_\phi \left[ \exp \left\{ -i \int_0^L d^d x \phi_x^\dagger K \phi_x \right\} |\phi^\dagger R \phi\rangle \right]$$

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A cTN is obtained by “mixing” **statistical field theories**.

- ▶ Can be evaluated by Monte-Carlo
- ▶ What about CFTs?

# Conclusion

- ▶ For a cTN, we may want **finite** or **infinite** bond dimension
- ▶ If finite, 2 “natural” **different** constructions:
  - ▶ with random curves
  - ▶ with random fields
- ▶ Carefully choosing the randomness complements the optimization of the tensor
- ▶ Nothing is done but it seems (at least mathematically) interesting