

# Lecture on TREE TENSOR NETWORKS

LATTICE QUANTUM SYSTEM

# SITES  
 $N$

LOCAL DIMENSION  
 $d$

PHYSICAL DIMENSION/LATTICE GEOMETRY  
1D, 2D...

OTHER  
 ↳ STATISTICS  
 ↳ SPIN/BOSON VS FERMION  
 ↳ INTERACTIONS

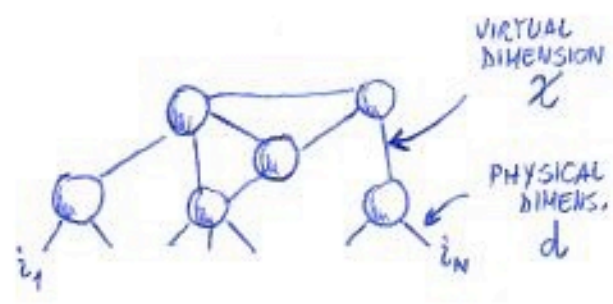
## QUANTUM MANY-BODY (PURE) STATE

$$|\Psi\rangle = \sum_{i_1, \dots, i_N=1}^d \mathbb{I}_{i_1, \dots, i_N} |i_1, \dots, i_N\rangle$$

(REAL SPACE) BASIS PRODUCT BASIS

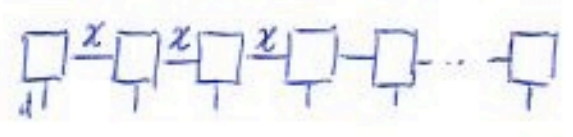


TAILORED VARIATIONAL WAVEFUNCTION ANSATZ



FOR 1D

MATRIX PRODUCT STATES ARE VERY SUCCESSFUL  
 ↳ OBC FINITE SYSTEM  
 ↳ INFINITE SYSTEM  
 ÖSTLUND, ROMMER; PRL 75, 3537 (1995)  
 SCHOUWÖCK; ANN. PHYS 326, 96 (2011)



Several interesting properties

- ① Loopless (EXCEPT FINITE PBC) → CANONICAL FORM CAN BE REACHED WITH SINGLE-TENSOR STD. LINEAR ALGEBRA → SIMPLE EIGENPROBLEMS (NOT GENERALIZED)

② Area-Law

FOR NONCRITICAL 1D QUANTUM STATES  $S \propto L^0$

[BIPARTITION ENTANGLEMENT]  $S_{ENT} \leq \log \chi \rightarrow \chi \propto L^0$

③ NON-CRITICAL Correlations

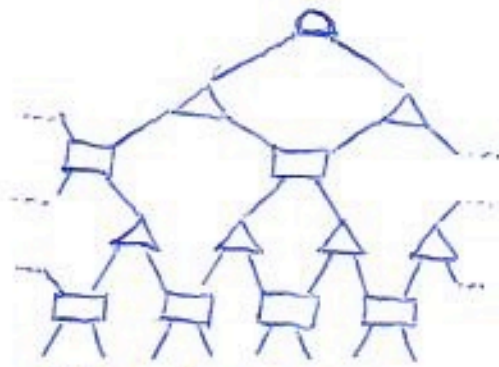
$$\langle \mathcal{O}_s \mathcal{O}_{s+l} \rangle = \left( \begin{array}{c} \text{---} \text{---} \text{---} \text{---} \text{---} \text{---} \\ \text{---} \text{---} \text{---} \text{---} \text{---} \end{array} \right) = Q_L T^l Q_R = \sum c_q e^{-l/\xi_q}$$

WHAT IF I WANT TO REPRESENT A CRITICAL THEORY ?

$$S \approx \frac{c}{6} \log L \text{ BUT } S \leq \log \chi \Rightarrow \chi \geq b L^{c/6}$$

MUST SCALE!

NOT A DEALBREAKER BUT STILL



BINARY "FULL" MERA

## MERA

VIVALI; PRL 99, 220405 (2007)

MULTISCALE ENTANGLEMENT RENORMALIZATION ANSATZ

### DISENTANGLERS

UNITARIES  $U$   
 $U^\dagger U = U U^\dagger = \mathbb{1}$

### ISOMETRIES

ISOMETRY  $V$   
 $V^\dagger V = \mathbb{1}$

✓ REPRESENT CRITICAL STATES OF FINITE  $\chi$  (STATIC)

$$\langle \mathcal{O}_i, \mathcal{O}_{j+l} \rangle = \dots = \sum c_q e^{\lambda q}$$

HONGANERO et al. PRS 80, 113103 (2009)

! INTERESTING CONNECTIONS WITH HOLOGRAPHY  
 MERA  $\leftrightarrow$  AdS/CFT

SWINGLE; PRD 86, 065007 (2012)

✗ LOOPY

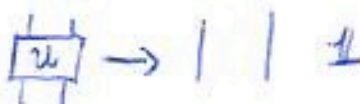
- CANONICAL FORM CAN NOT BE ESTABLISHED
- A NON-FLEXIBLE CANONICAL FORM HAS TO BE ENFORCED BY UNITARY DISENTANGLERS
- ↳ CONSTRAINED PROBLEM OF LINEAR ALGEBRA
- GENERALIZED EIGENVALUE PROBLEMS

ALSO PEPS, PBCMPS, LPTN SUFFER FROM THIS DRAWBACK

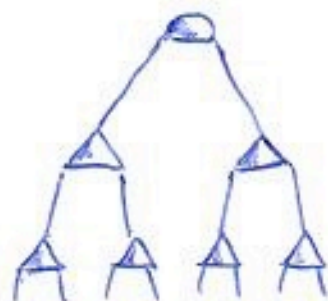
✗ FINALLY, THE SCALING OF ALGORITHM IS  $\chi^8$  OR WORSE

FOR COMPARISON [ MPS SHORT RANGE  $\chi^3 d^2$  ; LONG RANGE  $\min(\chi^4 d^2, N^2 \chi^3 d^2)$  ]

AN INTERESTING OPTION TO ADDRESS THESE PROBLEMS



REMOVE ALL UNITARIES



TREE TENSOR NETWORK

← BINARY TTN ANSATZ

TTN 2

# TTN CONCEPTUAL SIGNIFICANCE

- LIKE AN MPS, IS THE TENSOR NETWORK ANSATZ RELATED TO DMRG
- THE TTN IS THE TENSOR NETWORK ANSATZ RELATED TO REAL-SPACE RG-FLOW

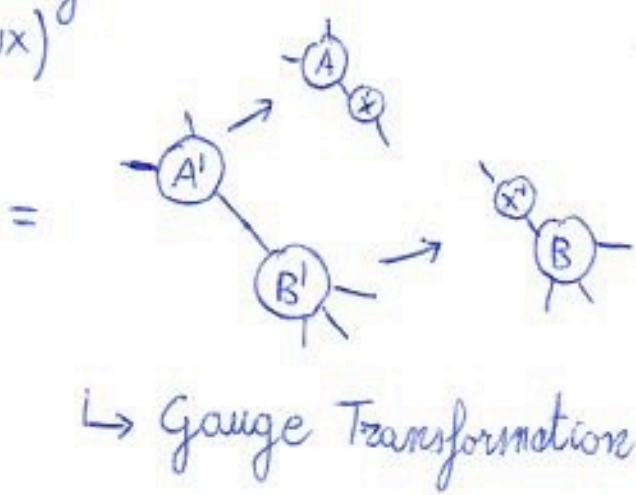
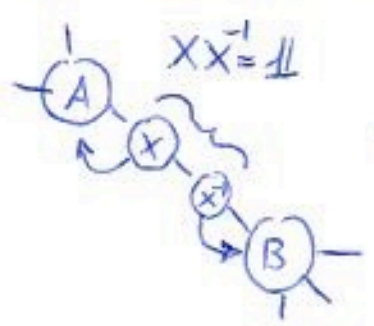
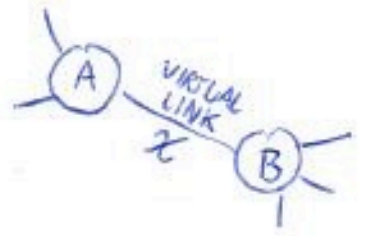


## TTN - Properties:

- ① Loopless  $\rightarrow$  FLEXIBLE CANONICAL FORM
- $\rightarrow$  ANY TENSOR CAN BE TURNED INTO GAUGE CENTER VIA SINGLE-TENSOR LINEAR ALGEBRA

## What does that mean?

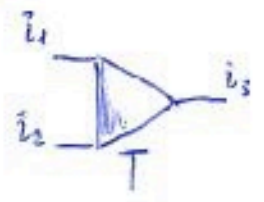
### A TENSOR NETWORK GAUGE TRANSFORMATION (X INVERTIBLE MATRIX)



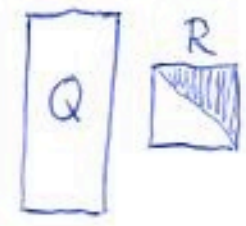
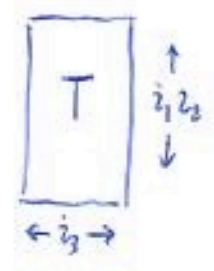
- $\rightarrow$  SAME STATE
- $\rightarrow$  SAME NETWORK GEOMETRY

### B Isometrization via QR decomposition

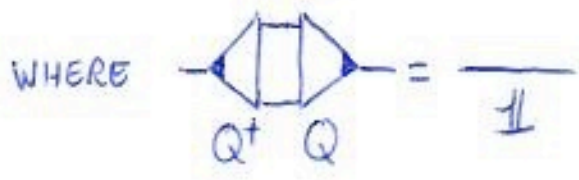
{ "THIN" QR FACTORIZATION



WRITTEN AS A MATRIX  
 $(i_1, i_2) \times i_3$   
 $\chi^2 \times \chi$   
 ROWS COLUMNS

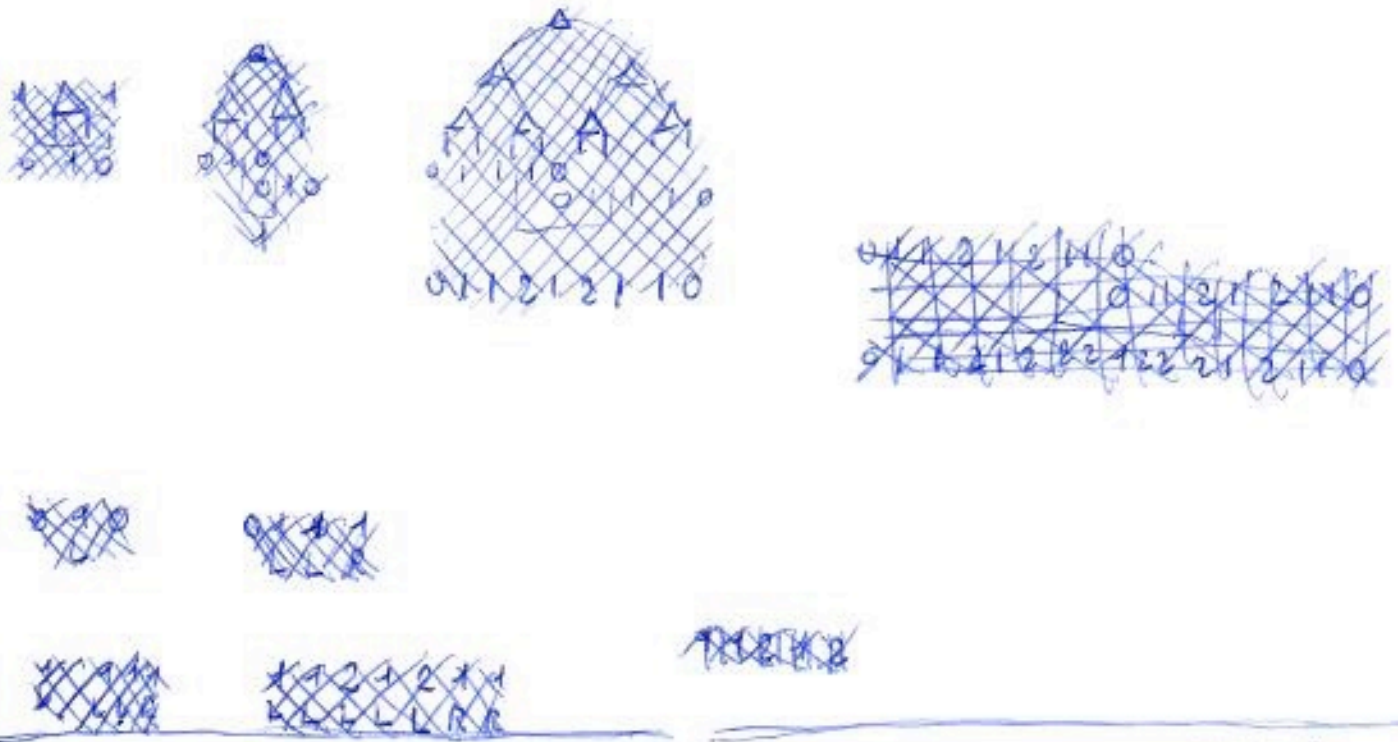


$Q^+ Q = 1_{\chi \times \chi}$   
 R UPPER TRIANGULAR  $\chi \times \chi$



THE R CAN BE ABSORBED IN THE ADJACENT TENSOR

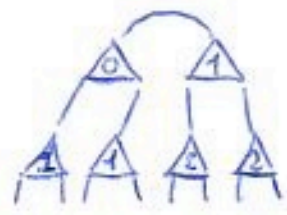
$\hookrightarrow$  GAUGE TRANSFORMATION



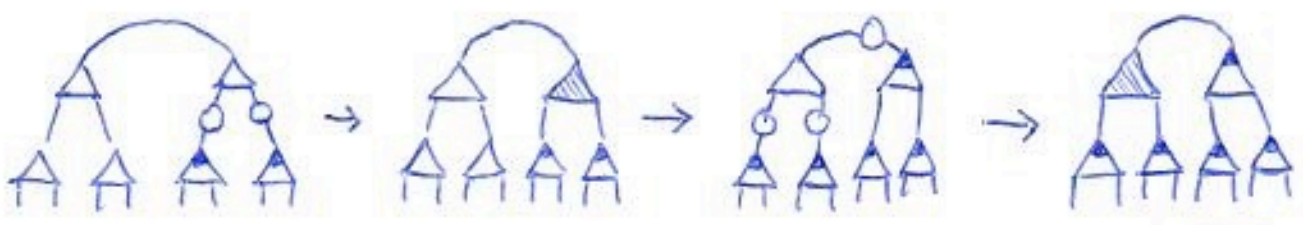
**Ⓢ** Establishing the CENTRAL GAUGE (TOWARDS ANY NODE)



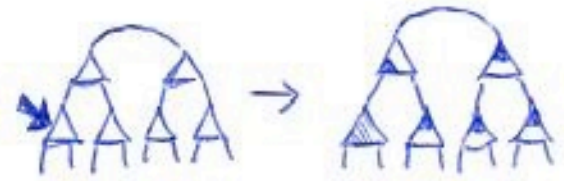
→ STEP 1: DETERMINE NETWORK-GEOMETRY DISTANCES FROM THE TARGET NODE



→ STEP 2: FROM HIGHER TO LOWER DISTANCES REPEAT  
 ↳ QR DECOMPOSITION TOWARDS LOWER DISTANCE  
 ↳ ABSORB  $(R)$  MATRIX INTO LOWER DISTANCE TENSOR



IT'S NOT ALWAYS UPWARD



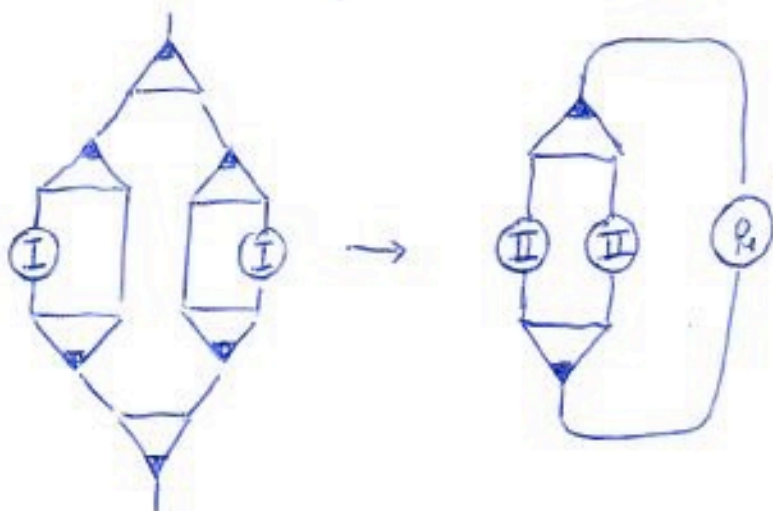
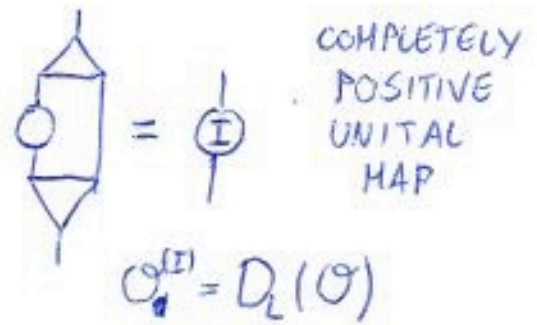
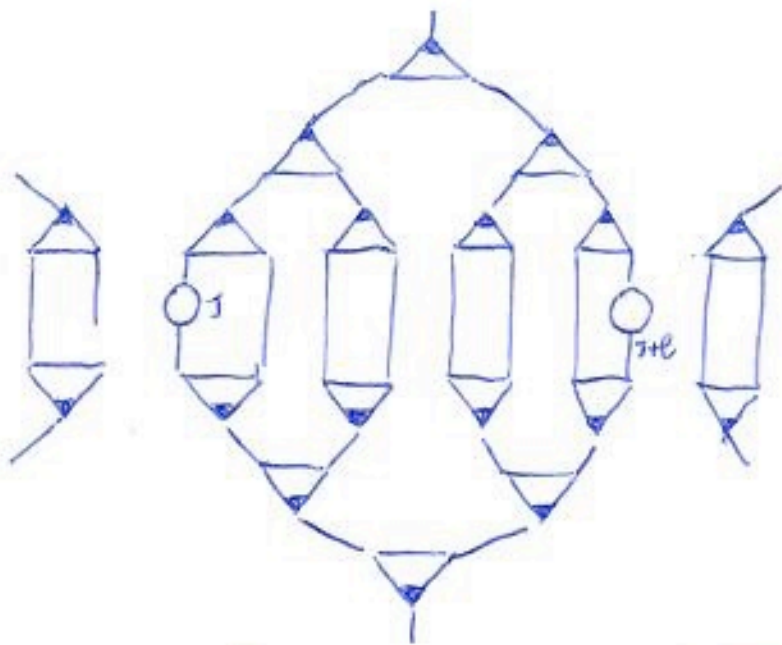
Huge Benefit

$$\langle \Psi | \Psi \rangle = \text{[Diagram 1]} = \text{[Diagram 2]} = \text{[Diagram 3]} = \text{[Diagram 4]} \quad \text{FROBENIUS NORM SQUARE OF } T'$$

② CRITICALITY AT FINITE  $\chi$  (EVEN THOUGH ENTANGLEMENT ENTROPY IS FRACTAL IN THE PARTITION)

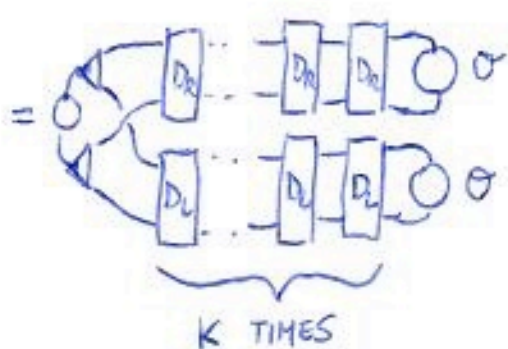
↳ WE ASSUME A BULK OF HOMOGENEOUS TENSORS [GAUGED UP]

↳ LET US CALCULATE  $\langle \mathcal{O}_j \mathcal{O}_{j+l} \rangle$  WITH  $j = 2^q + 1$  AND  $l = 2^k - 1$



ALL THE REST OF THE TENSOR NETWORK CONTRACTS INTO A DENSITY MATRIX  $\chi \times \chi$

$$\langle \mathcal{O}_j \mathcal{O}_{j+2^k-1} \rangle = \text{Tr} \left[ \rho_1 T(D_L^k(\mathcal{O}) \otimes D_R^k(\mathcal{O})) T^+ \right]$$



$$= \sum_i c_q \lambda_q^K = \sum_i c_q e^{-K \eta'_q}$$

$$= \sum_i c_q \left( e^{\frac{\log(e+1)}{\log 2}} \right)^{-\eta'_q} = \sum_i c_q (e \pm 1)^{-\eta'_q}$$

FOR AVERAGES

POWER-LAW CORRELATIONS

③ Algorithms that scale PRETTY WELL  $\chi^4$  { SINGLE TENSOR UPDATE  
 ( SHORT RANGE INTERACTION  $\sim \chi^4$  ; LONG RANGE INTERACTION  $\sim \chi^2$  ; THREE BODY INTERACTION  $\leq \chi^6$  )

The DMRG-LIKE algorithm FOR TTN

GERSTER et al  
PRB 90, 125164 (2014)

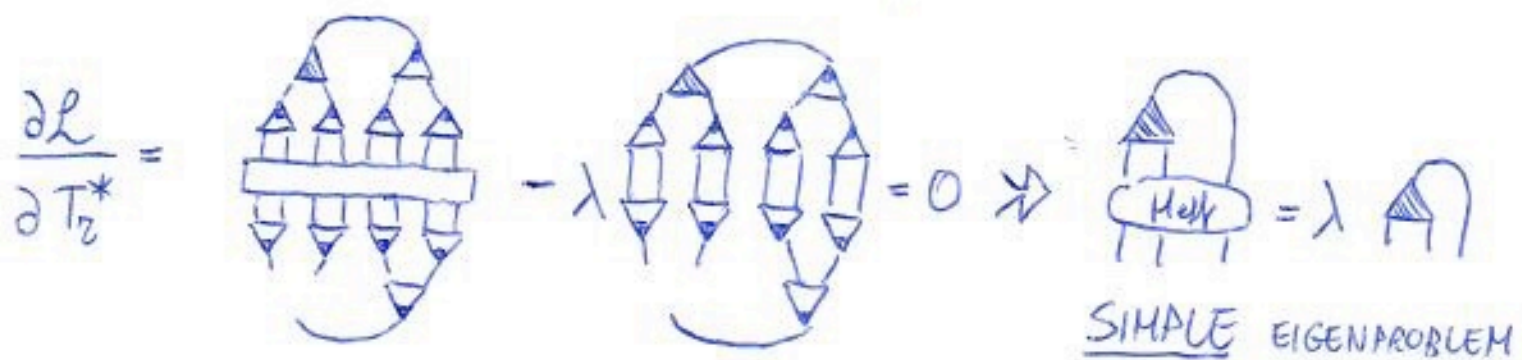
**TASK** GROUND STATE OF AN HAMILTONIAN  $H$ :  
 MINIMIZE  $\langle \Psi | H | \Psi \rangle$  WITH CONSTRAINT  $\langle \Psi | \Psi \rangle = 1$

Lagrangian  $\langle \Psi | H | \Psi \rangle - \lambda \langle \Psi | \Psi \rangle = \mathcal{L}$

Euler-Lagrange Equation  $\frac{\partial \mathcal{L}}{\partial \{\alpha\}} = 0$  { FOR A BUNCH OF PARAMETERS  $\{\alpha\}$  OF THE ANSATZ

**RULE** Single-Tensor update  $\{\alpha\} = T_{\alpha}$

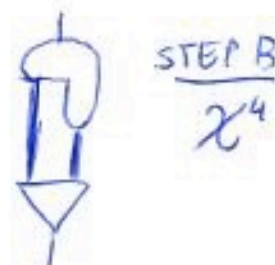
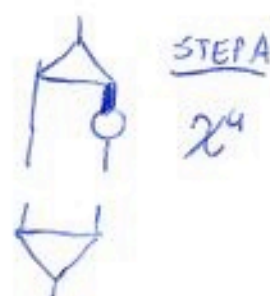
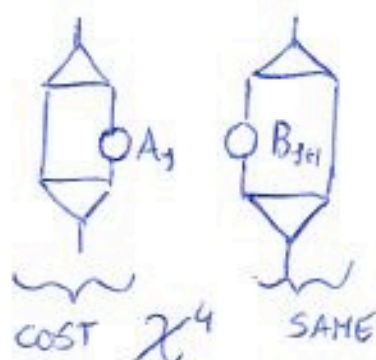
↳ CONVERT THE TTN IN CENTRAL GAUGE TOWARDS NODE  $z$   
 ↳ FIX ALL TENSORS EXCEPT  $T_z$  AND VARIATE THAT



AFTER FINDING MINIMUM ENERGY  $\lambda$ , CHANGE TENSOR AND REPEAT, JUST LIKE IN HEAN-FIELD.

**COST**

FOR A SINGLE HAMILTONIAN COMPONENT  $h_{j_1 j_2} = \sum_i A_j B_{j_2 i}$



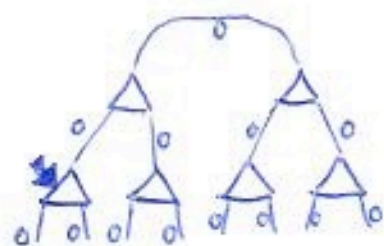
ALSO OTHER SUBROUTINES COST THE SAME

# The TIME-DEPENDENT VARIATIONAL ALGORITHM (TDVP) for TTN <sup>(TTN 4)</sup>

Evolve the TTN state  $|\Psi_{TTN}\rangle$  according to Schrödinger equation  $\frac{d}{dt}|\Psi\rangle = -iH|\Psi\rangle$

MPS-TDVP HAGEBANN et al PRL 101, 070601 (2011)  
TTN-TDVP KOHN et al PRA 101, 023617 (2020)

## (RULE) SINGLE TENSOR UPDATE (CHEAPEST $\chi^4$ )



WRITE THE "INTERNAL TIME" FOR EACH SPACE,  $\left\{ \begin{array}{l} \text{PHYSICAL AND} \\ \text{VIRTUAL} \end{array} \right.$   
 $\hookrightarrow$  OUR GOAL IS TO EVOLVE TO "+1" (ONE TIME-STEP FORWARD) EVERYWHERE

GAUGE AND EFFECTIVE HAMILTONIAN



$$H_{\text{eff}} = \langle \Psi | H | \Psi \rangle$$

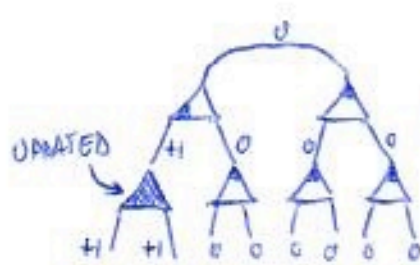
INTEGRATE evolve  $T$  using  $H_{\text{eff}}$

$$\frac{d}{dt}|T\rangle = -iH_{\text{eff}}|T\rangle$$

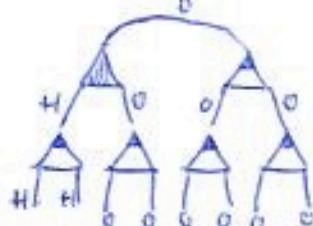
$$|T(0)\rangle \longrightarrow |T(+dt)\rangle$$

ANY SCHRÖDINGER INTEGRATOR, FOR EXAMPLE RUNGE-KUTTA

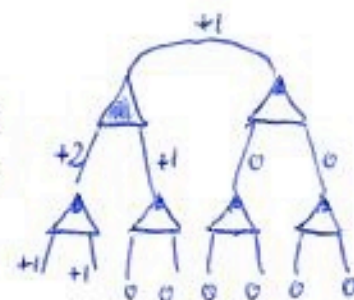
$\hookrightarrow$  SUBSTITUTE IN THE TTN



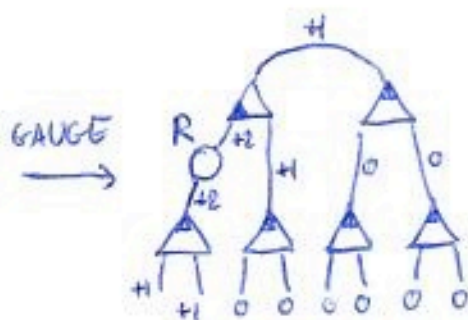
GAUGE



EVOLVE



THE +2 LINK EVOLVED "TOO MUCH", WE NEED TO SEND IT BACKWARDS

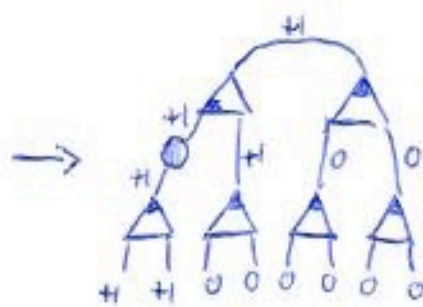


CALCULATE

$$K_{\text{eff}} = \langle \Psi | H | \Psi \rangle$$

EVOLVE  $R$  WITH  $K_{\text{eff}}$

BY  $(-dt)$   $\leftarrow$  BACKWARDS IN TIME



CONTINUE UNTIL ALL "+1"

# ④ Geometries suitable for TTN

↳ 1D FINITE OBC ✓ OFTEN COMPETITIVE WITH DMRG

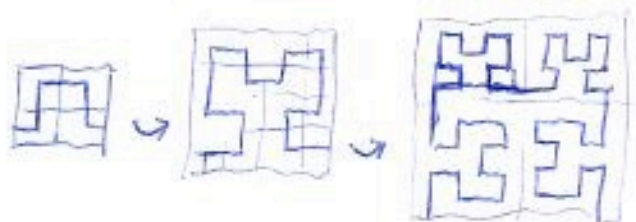
↳ 1D FINITE PBC ✓ EXCELLENT!

↳ 1D INFINITE WELL... THAT'S WILSON'S RG, WHICH WORKS SINCE 60 years

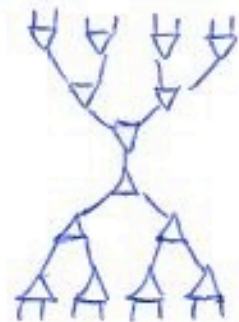
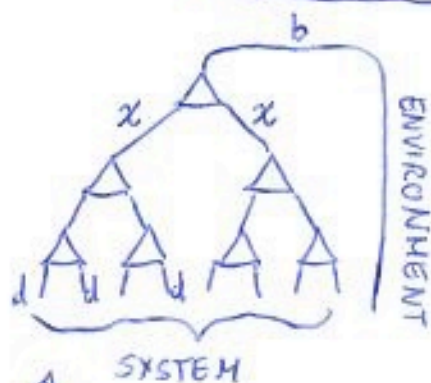
↳ 2D FINITE ?! IT WORKS WELL SOMETIMES (LATTICE GEOM) ↳ HINDERED BY RVB (PEPS-LIKE STATES)

BY THE WAY FOR 2D SQUARE LATTICE WITH 3-LEG TENSOR TTN

MAP THE 2D LATTICE INTO 1D WITH HILBERT CURVE



## ↳ OPEN SYSTEM: THE TREE TENSOR OPERATOR ANSATZ



↳ SUITABLE ANSATZ TO CALCULATE ENTANGLEMENT MONOTONES  
ARCECI et al.; PRL 128, 040501 (2022)

## DRAWBACKS OF THE TTN Ansatz

- ☹️ TRANSLATIONAL INVARIANCE IS BROKEN (ALSO FOR HERA)
  - ↳ IMPOSSIBLE TO SIMULTANEOUSLY ENFORCE SCALE AND TRANSLATION ON A LATTICE
- ☹️ Entanglement CLUSTERING due to "UNFORTUNATE" PARTITIONS  
FERRIS; PRB 87, 125139 (2013)