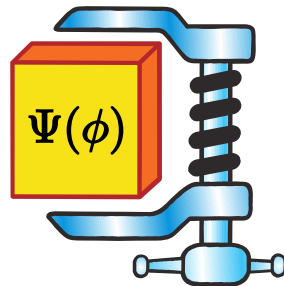


# Tensor network states for relativistic quantum field theory

Seminar at FU Berlin



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**Antoine Tilloy**

Jan 31st, 2024  
Berlin



PSL 



PSL 

*Inria*



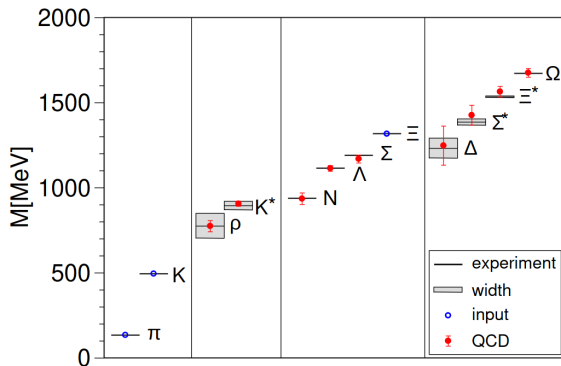
# Goal: strongly coupled relativistic field theories

QCD  $\equiv$  High  $T_c$  supra of HEP

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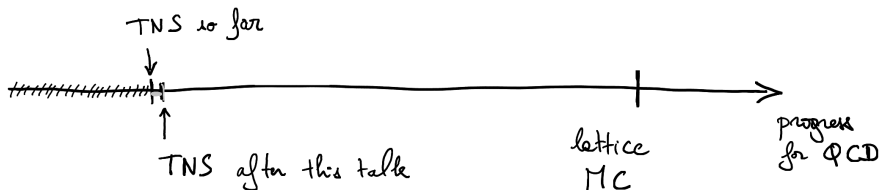
QCD  $\equiv$  High  $T_c$  supra of HEP

Monte Carlo on Wick-rotated lattice-discretized = only game in town



Science, 2008, BMW collaboration

# With tensor network states

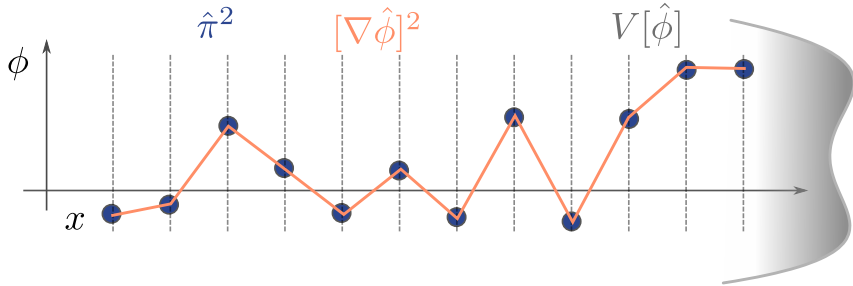


- ▶  $3 + 1$  dimensions
- ▶ Relativistic fermions
- ▶ Gauge fields
- ▶ Taking the continuum limit for relativistic models ← **today**

**Objective:** understand the continuum on the simplest non-trivial model:  $\phi_2^4$

Relativistic field theory as a condensed  
matter system

# Casual definition of a relativistic scalar field $\phi_2^4$



## Hamiltonian

A continuum of nearest neighbor coupled anharmonic oscillators

$$\hat{H} = \int_{\mathbb{R}} dx \quad \underbrace{\frac{\hat{\pi}(x)^2}{2}}_{\text{on-site inertia}} + \underbrace{\frac{[\nabla \hat{\phi}(x)]^2}{2}}_{\text{spatial stiffness}} + \underbrace{\frac{m^2 \hat{\phi}^2(x)}{2} + g \hat{\phi}^4(x)}_{\text{on-site potential } \hat{V}}$$

with  $[\hat{\phi}(x), \hat{\pi}(y)] = i\delta(x - y)\mathbb{1}$  – i.e. bosons / harmonic oscillators

# Better definition of $\phi_2^4$

Renormalized  $\phi_2^4$  theory

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

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1. Rigorously defined relativistic QFT without cutoff (Wightman QFT)
2. Vacuum energy density  $\varepsilon_0$  finite for all  $g$
3. Difficult to solve unless  $g \ll m^2$  – not integrable
4. Phase transition around  $f_c = \frac{g}{4m^2} = 11$  i.e.  $g \simeq 2.7$  in mass units



# Two (main) games in town

## Perturbation theory

+ resummation

$$\Lambda = -12 \text{ (bubble)} g^2 + 288 \text{ (triangle)} g^3 +$$

$$- \left( 2304 \text{ (cylinder)} + 2592 \text{ (cube)} + 10368 \text{ (tetrahedron)} \right) g^4 + \mathcal{O}(g^5)$$

$$\Gamma_2 = -96 \text{ (self-energy)} g^2 + \left[ 1152 \text{ (triangle)} + 3456 \text{ (triangle)} \right] g^3 - \left[ 41472 \text{ (triangle)} + 13824 \text{ (triangle)} \right]$$

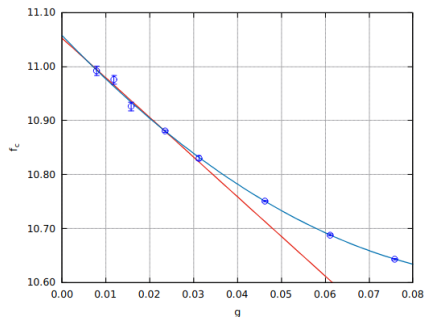
$$+ 82944 \text{ (triangle)} + 41472 \text{ (cylinder)} + 82944 \text{ (triangle)} + 27648 \text{ (cylinder)} \Big] g^4 + \mathcal{O}(g^5),$$

state of the art is  $O(g^8)$

arXiv:1805.05882

Serone, Spada, Villadoro

## Lattice Monte-Carlo



arXiv:1807.03381

Bronzin, De Palma, Guagnelli

Short distance troubles

# Similarity between relativistic and critical models

- ▶ A critical model is scale invariant in the IR

$$\langle \mathcal{O}(x)\mathcal{O}(y) \rangle \underset{|x-y| \rightarrow +\infty}{\sim} \frac{1}{|x-y|^{2\Delta_{\mathcal{O}}}}$$

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## Consequence on entanglement

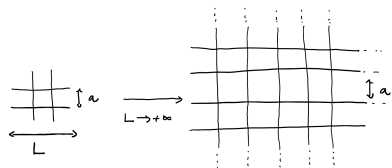
With a UV cutoff  $\Lambda = 1/a$  in  $1+1$  dimensions:

$$S \propto \log(\Lambda)$$

$\Rightarrow$  infinite amount of information in high frequency modes

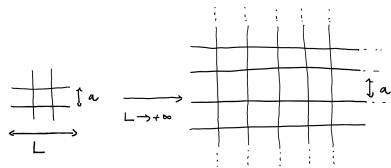
# Consequence for lattice discretizations

1. **easy:** taking thermodynamic limit



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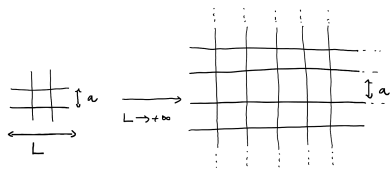


2. **hard**: taking small lattice spacing

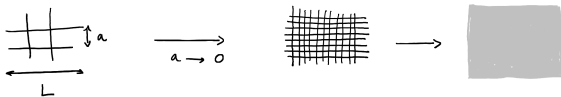


# Consequence for lattice discretizations

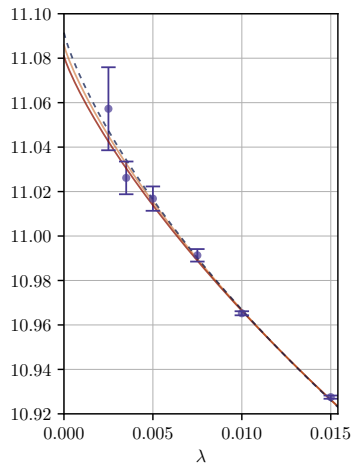
## 1. easy: taking thermodynamic limit



## 2. hard: taking small lattice spacing



*A finely discretized relativistic QFT, seen as a lattice model, is almost critical.*



$f_c$  estimate continuum  
extrapolation with GILT-TNR  
Clément Delcamp, AT, 2020



# UV “criticality” is usually milder than IR criticality

UV CFT tend to be kind

For QFT that are either

1. **super renormalizable** or
2. **asymptotically free**

the critical behavior at short distance is **free**

# UV “criticality” is usually milder than IR criticality

## UV CFT tend to be kind

For QFT that are either

1. **super renormalizable** or
2. **asymptotically free**

the critical behavior at short distance is **free**

E.g. for  $\phi_2^4$  at short distances

$$H \longrightarrow H_0 = \int dx \frac{:\pi^2:_m}{2} + \frac{:(\nabla\phi)^2:_m}{2} + \frac{m^2}{2} : \phi^2 :_m$$

which is exactly solvable

# Objective

Stop wasting parameters on short distance criticality

1. Disentangle the trivial UV behavior
2. Put some tensor network on top to deal with the IR

# Gaussian disentangling

# Disentangle short distance criticality

## 1 – Bogoliubov transform

Define modes  $a(p), a^\dagger(p)$  as

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

which verify  $[a(p), a^\dagger(q)] = 2\pi \delta(p - q)$  and yield

$$H_0 = \int_{\mathbb{R}} dp \, \omega_p \, a_p^\dagger a_p$$

The ground state of  $H_0$  is the Fock vacuum, i.e.  $|\text{GS}\rangle = |0\rangle$  with  $\forall p, a_p|0\rangle = 0$

# Disentangle short distance criticality

## 2 – Go back to real space

Fourier transform the modes  $a_p$

$$a(x) = \frac{1}{2\pi} \int_{\mathbb{R}} dp e^{ipx} a_p$$

which enforces  $[a(x), a^\dagger(y)] = \delta(x - y)$

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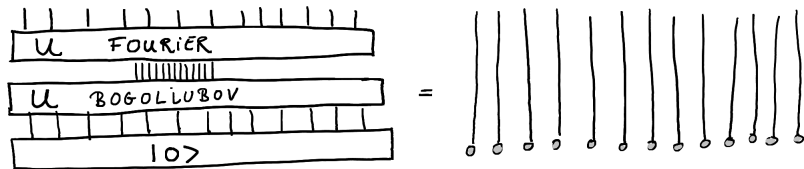
which enforces  $[a(x), a^\dagger(y)] = \delta(x - y)$

### Note

1. We integrate with  $dp$  not  $\omega_p^{-1/2} dp$
2.  $\phi$  is *not* a local function of  $a, a^\dagger$

$$\phi(x) = \int_{\mathbb{R}} dy J(x - y) [a(y) + a^\dagger(y)] \quad \text{with} \quad J(x) = \int_{\mathbb{R}} \frac{dp}{\sqrt{2\omega_p}} e^{ipx}$$

# Tensor network intuition



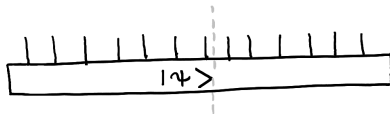


# Free particle entanglement entropy

We now have two possible ways to split  $\mathcal{H} = \mathcal{H}_- \otimes \mathcal{H}_+$

1. Standard one, yielding  $S \propto \log \Lambda$

$$\mathcal{H}_+ = \text{span}\{\phi(x_1) \cdots \phi(x_n) |\Omega_+\rangle\} \quad \text{for } x \geq 0\}$$

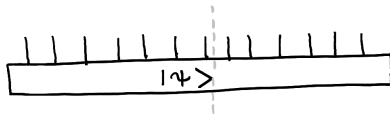


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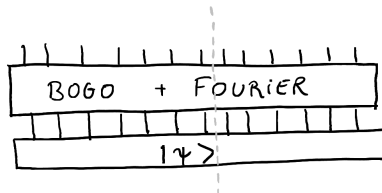
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2. The free particle one  $S_{\text{free}}$

$$\mathcal{H}_+ = \text{span}\{a^\dagger(x_1) \cdots a^\dagger(x_n) |0\rangle \text{ for } x \geq 0\}$$



# Free particle entanglement entropy

Super-renormalizability  $\implies$  Gaussian disentangling kills the divergent part of  $S$ :

## Conjecture

For any bosonic QFT with strongly relevant interaction  $V(\phi)$  in  $1 + 1d$ , the free particle entanglement entropy  $S_{\text{free}}$  is **finite** in the ground state

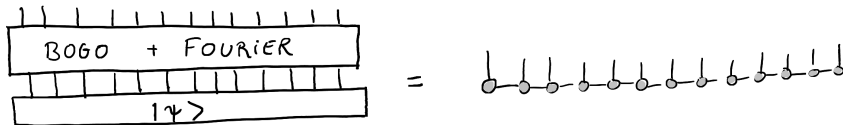
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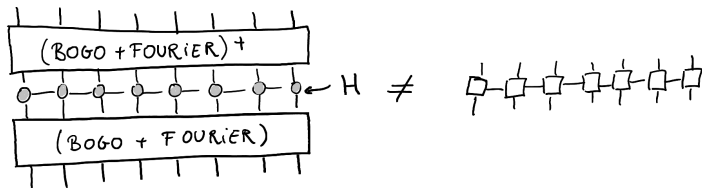
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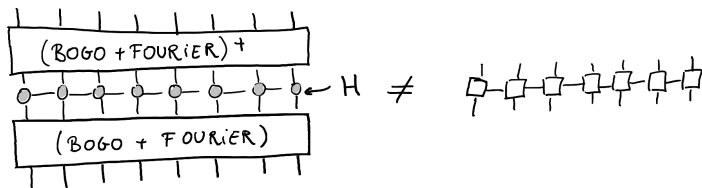
Hence the ground state has an efficient (continuous) MPS representation:



# Trading entanglement for (mild) non-locality

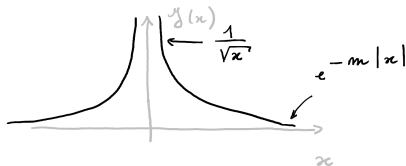


# Trading entanglement for (mild) non-locality



$H$  local in  $\phi(x)$  hence mildly non-local in  $a(x)$ , e.g.

$$\int dx \phi(x)^2 = \int dx \int dx_1 dx_2 J(x_1 - x) J(x_2 - x) (a(x_1) + a^\dagger(x_1))(a(x_2) + a^\dagger(x_2))$$



1. UV singular

$$J(x) \underset{0}{\sim} \frac{1}{\sqrt{|x|}}$$

2. IR nice

$$J(x) \underset{+\infty}{\sim} e^{-m|x|}$$

# Remarks on Gaussian disentanglement

Idea used the lattice, in Quantum chemistry, for impurity models e.g.

- ▶ Krumnow, Veis, Legeza, and Eisert 2016
- ▶ Wu, Fishman, Pixley, Stoudenmire 2022

Here minor differences

1. The disentangler is not optimized (not needed)
2. The disentangler does not have a simple local representation
3. The disentangler makes the optimization well defined → kills divergence

Relativistic continuous matrix product  
states



# Relativistic continuous matrix product states

aka continuous matrix product states (CMPS) [Verstraete and Cirac 2010]  
on Gaussian disentanglement steroids

## Definition

RCMPSs are a manifold of states parameterized by 2  $(D \times D)$  matrices  $Q, R$

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

with

- ▶  $|0\rangle$  is the Fock vacuum of the free model  $H_0$
- ▶ trace taken over  $\mathbb{C}^D$
- ▶  $\mathcal{P}$  path-ordering exponential

# Basic properties of RCMPS

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

## Checklist:

1. **Extensive** because of  $\mathcal{P} \exp \int$
2. Observables **computable** at cost  $D^3$  (non trivial!)  
requires  $[a(x), a^\dagger(y)] = \delta(x - y)$
3. **No UV problems**  
 $|0, 0\rangle = |0\rangle$  is the ground state of  $H_0$  hence exact CFT UV fixed point  
 $\langle Q, R | : P(\phi) : |Q, R\rangle$  is finite for all  $Q, R$  (not trivial!)

# Tensor network intuition

The diagram illustrates an equation between two tensor network representations. On the left, a vertical stack of three tensors is shown. The top and bottom tensors are labeled "BOGO + FOURIER" and feature a horizontal chain of eight nodes with vertical lines connecting them to the tensor boxes. The middle tensor is labeled  $:\phi^n(o):$  and has vertical lines connecting to the chains of the top and bottom tensors. On the right, the expression  $= \frac{\partial^n}{\partial \alpha^n}$  is followed by a tensor network consisting of a 2x8 grid of squares. The top row of squares is shaded in a gradient from light to dark, while the bottom row is light gray. Vertical lines connect the squares in each column. To the right of this grid is a vertical line with the label  $|_{K=0}$ .

In the **continuum limit** contracting a non-uniform ladder is numerically exact with high order Runge-Kutta.

# The variational algorithm

## Optimization

Compute  $e_0 = \langle Q, R | h | Q, R \rangle$  and  $\nabla_{Q,R} e_0$

Minimize  $e_0$  with (geometric improvements of) gradient descent

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

1.  $V_b = \langle :e^{b\phi(x)}: \rangle_{QR}$  computable by solving an ODE with cost  $\propto D^3$
2.  $\langle : \phi^n : \rangle_{QR}$  computable doing  $\partial_b^n V_b \Big|_{b=0} \rightarrow \propto D^3$
3.  $e_0 = \langle h \rangle_{QR}$  computable by summing such terms at cost  $D^3 \rightarrow \propto D^3$
4.  $\nabla e_0$  computable by solving the adjoint ODE (backpropagation)  $\rightarrow \propto D^3$

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Functioning Julia implementation. `OptimKit.jl` to solve the Riemannian minimization, `KrylovKit.jl` to solve fixed point equations, `DifferentialEquations.jl` (Vern7 solver) to solve ODE. Soon `Rcmps.jl`?

# Using the optimized state

**After optimization:**  $|Q, R\rangle \simeq |0\rangle_{\text{int.}}$  with  $\langle Q, R | \hat{h} | Q, R \rangle = e_0 + \varepsilon$

**This gives:**

- All equal-time  $N$ -point functions

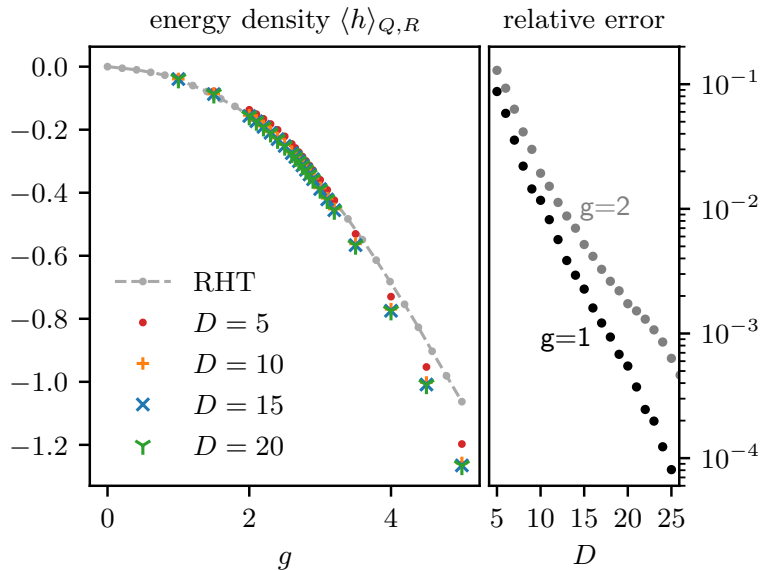
$$\langle \phi(x_1) \phi(x_2) \cdots \phi(x_n) \rangle \simeq \langle Q, R | \phi(x_1) \phi(x_2) \cdots \phi(x_n) | Q, R \rangle$$

at cost  $D^3$  by solving coupled linear ODEs

- In particular *all* Euclidean 2-point functions  $\implies$  spectral function

$$\langle \phi(x) \phi(0) \rangle = \int_0^{+\infty} d\mu \, \mu \rho(\mu) K_0(\mu x)$$

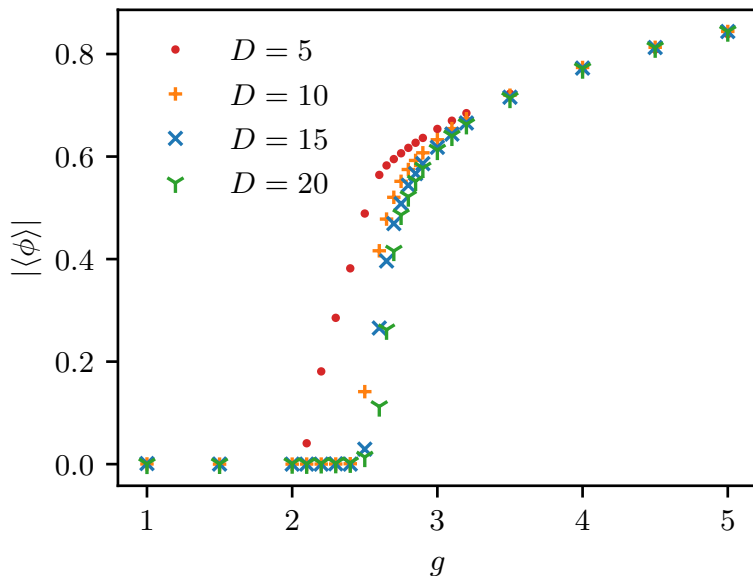
# Results: $\phi_2^4$ energy density



**New:**  $D$  can now be pushed to 32 or even 64 with some effort



Results:  $\phi_2^4$  – field expectation value  $\langle\phi\rangle$



**New:** the mass can be fitted from 2-point function and agrees with RHT to  $10^{-3}$

# Todo-list for continuous tensor networks

## In $1+1$ dimensions

- ▶ Solve Fermion / Gauge theories
- ▶ Go beyond strongly renormalizable interactions
- ▶ Do general CFT perturbations
- ▶ Compute more observables (masses, spectra,  $c$ -function...)

**And of course the grand goal:** do higher dimensions!

Many problems, feel free to attack them!

# Summary

## Problem

- Relativistic QFT have infinite entanglement at short distance

## Solution in $1 + 1$ d

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

1. Ansatz for  $1 + 1$  relativistic QFT
2. The  $\phi(x) \rightarrow a(x)$  trick disentangles the divergent UV
3. The CMPS on top solves the rest
4. Efficient (cost poly  $D$ , error plausibly  $1/\text{superpoly } D$ )

