# Simulation methods in physics

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## Intro

- This course covers (mostly) basic + somewhat more advanced Monte Carlo methods *lattice MC simulations*.
- Monte Carlo is an extremely broad term many (not necessarily computer!) simulation methods involving random numbers are called Monte Carlo such-and-such.
- In these lectures, we shall mostly concentrate on solving *partition functions* on a (usually) regular *lattice*:

$$Z = \int \left[ \prod_{\mathbf{x}} d\phi(\mathbf{x}) \right] \exp\left[-\frac{1}{k_B T} H(\phi)\right]$$

Here  $H(\phi)$  is the Hamiltonian (energy) of the system,  $k_B$  the Boltzmann constant and T temperature.

The coordinates are

$$\mathbf{x}_i = \mathbf{a}n_i, \qquad n_i = 0 \dots N_i$$

where *a* is the *lattice spacing* (physical length), and the lattice has

$$N = \prod_{i=1}^{d} N_i$$

discrete points (i.e. the box is d -dimensional).

- The integral is N× dim(φ) -dimensional well-defined, in principle computable! However, the dimensionality is huge typically 10<sup>6</sup> 10<sup>9</sup> → Monte Carlo integration is needed.
- Example: Ising model

$$Z = \sum_{\{s_i = \pm 1\}} \exp[-\beta/2 \sum_{\langle ij \rangle} (1 - s_i s_j)]$$

Here the sum in the exponent goes over the nearest-neighbour sites of the lattice. (Note: dimensionless, "lattice" units!)

• Lots of applications within statistical physics and condensed matter physics (crystalline structure, spin models, superconductivity, surface physics, glassy systems ...)

#### Lattice field theory

• The Feynman path integral (in Euclidean spacetime):

$$Z = \int \left[\prod_{x} d\phi(x)\right] \exp[-S(\phi)]$$

- Discretize space → the path integral becomes mathematically welldefined. However, our space-time is not discrete → the results have to be extrapolated to the continuum limit, where the lattice spacing a goes to zero.
- Field theory on the lattice:
  - provides an explicit ultraviolet cutoff, removing the UV divergences so common in field theories. These have to be renormalized before the continuum limit is taken.
  - allows the use of (almost all of) the analytical tools used for continuum field theories – especially, the lattice perturbation the-

ory is equivalent to the standard one (but more cumbersome to use).

- provides new analytical methods and tools, not possible for continuum field theories (strong coupling/"high temperature" expansions, duality relations etc.).
- emphasizes the connection between *field theory and statistical mechanics*: Feynman path integral = partition function. All of the tools developed for statistical mechanics are at our disposal!
- permits the evaluation of the path integral numerically, using *Monte Carlo calculations*. The integral is evaluated as-is, without expanding it in any small parameter ( $\equiv$  *non-perturbative*).

#### Models studied in HEP context:

• Lattice QCD:

Almost all interesting QCD physics non-perturbative!

Since around 1980 Quantum Chromodynamics (QCD) has been studied extensively on the lattice. The results have given invaluable *qualitative* insights (confinement); and, during the last  $\sim$  5 years the results have also been *quantitatively* comparable to experiments.

• Confinement mechanism, hadronic mass spectrum, matrix elements ...

• QCD phase transition at  $T\approx 150\,$  GeV

Light hadron masses (CP-PACS collaboration, 2002).



• Electroweak phase transition:

Electroweak theory at T = 0 is perturbative: coupling constants are small, and the gauge bosons W, Z are massive. However, as T increases, the "broken SU(2) symmetry" is restored: gauge bosons become massless, and IR singularites make the theory nonperturbative.

Since  $\sim$  1994 EW theory (theories) have been studied extensively on the lattice, with very solid results  $\Rightarrow$  we know how the EW phase transition behaves. Applied also to MSSM (Minimal Supersymmetric Standard Model)

- Many other models ...
  - QED
  - Ginzburg-Landau theory (superconductivity)
  - Quantum gravity

#### Textbooks about MC methods:

- Gould, Tobochnik: An introduction to Computer Simulation Methods: Applications to Physical Systems. Pretty elementary.
- K. Binder und D.W. Heermann, Monte Carlo Simulation in Statistical Physics, Springer Series in Solid-State Sciences 80, Springer 1988. More condensed and advanced.

### Books about lattice field theory:

- M. Creutz, *Quarks, Gluons and Lattices*, Cambridge University Press 1983
- I. Montvay and G. Münster, *Quantum Fields on a Lattice*, Cambridge University Press 1994
- H.J. Rothe. *Lattice Gauge Theories: an Introduction*, World Scientific 1992

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