

MARKOV CHAINS (MC)

A sequence $\vec{x}_1, \dots, \vec{x}_n, \dots$

where prob of \vec{x}_{n+1} only depends on \vec{x}_n

A random walk is an example

MARKOV CHAIN MONTE CARLO (MCMC)

We saw the utility of generating \vec{x} according to pdf $f(\vec{x})$

We can use MC to do this.

Will not show how this works mathematically

Will instead give "recipe" - 1D for simplicity

① Pick arbitrary x_1

② Decide on x_2 based on a proposal

Proposal could be : x_2 random btw

$$\begin{aligned} &x_1 + \Delta x \\ &x_1 - \Delta x \end{aligned}$$

This is a symmetric proposal

$$\text{prob } (x_1 \xrightarrow{\text{propose}} x_2) = p(x_2 \xrightarrow{\text{propose}} x_1)$$

(Metropolis condition)

The "proposed" value is x_2^{prop}

③ I have a "proposal". Should I accept it?

$$\text{Calculate } \alpha = f(x_2^{\text{prop}}) / f(x_1)$$

$$\alpha = \min(1, \alpha) \quad \leftarrow \alpha \in [0, 1]$$

Accept the proposal with probability α

\Rightarrow if accepted $x_2 = x_2^{\text{proposal}}$

if not $x_2 = x_1$

④ Repeat

A

After many trials the sequence is
a good sampling of $f(x)$

A

Arbitrariness about starting point -

throw away the first few members
of the chain ("burn in")

A

Some things to notice

- Normalization of $f(x)$ not needed, since we are only taking ratios
- The initial value must be such that $f(x_0) > 0$
- The "proposal" function can be any function as long as it is non-zero in the domain of validity of $f(x)$