



UNIVERSITÉ
DE GENÈVE

FACULTÉ DES SCIENCES



Estimation of neutrino oscillation parameters with Markov Chain Monte Carlo (poster)

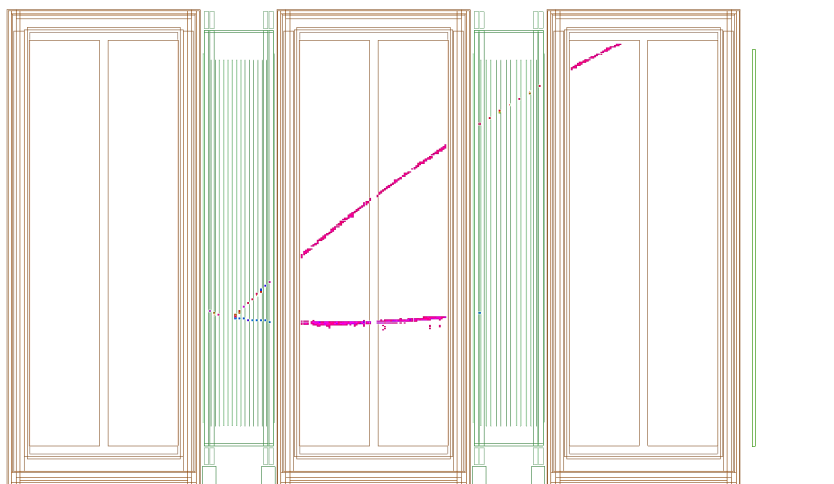
Leila Haegel (University of Geneva),
for the T2K collaboration

PhyStat v
30-05-2016

Or how to go from this:

Event number : 24083 | Partition : 63 | Run number : 4200 | Spill : 0 | SubRun number : 6 | Time : Sun 2010-03-21 22:33:25 JST | Trigger: Beam Spill

ND280



Super-Kamiokande I

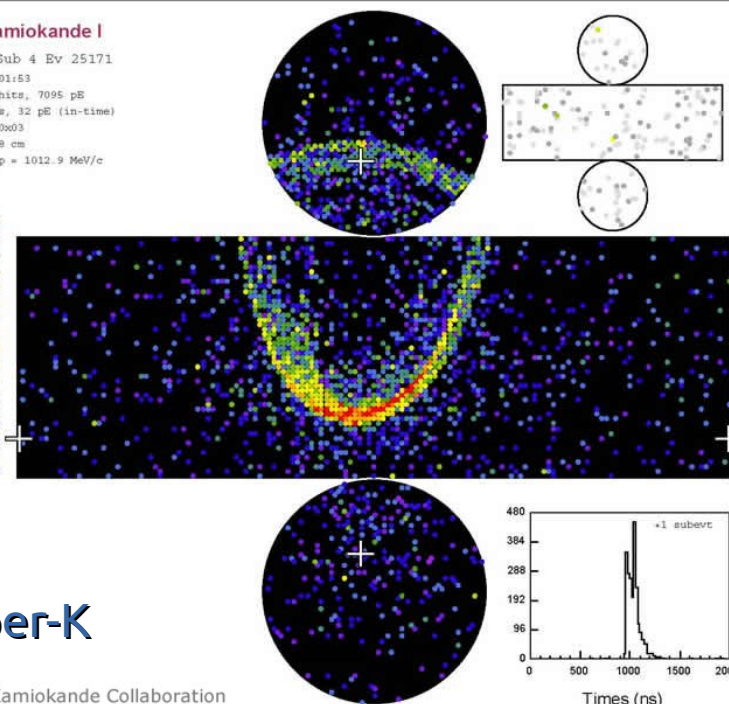
Run 1728 Sub 4 Ev 25171
96-05-29:08:01:53
Inner: 2294 hits, 7095 pE
Outer: 4 hits, 32 pE (in-time)
Trigger ID: 0x03
D wall: 592.8 cm
PC mu-like, $p = 1012.9$ MeV/c

Charge (pe)

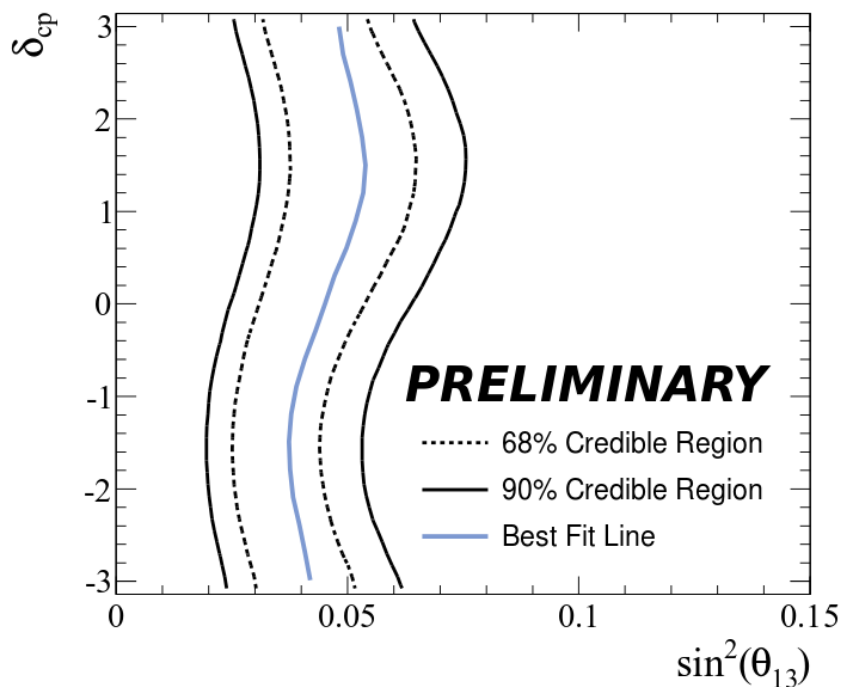
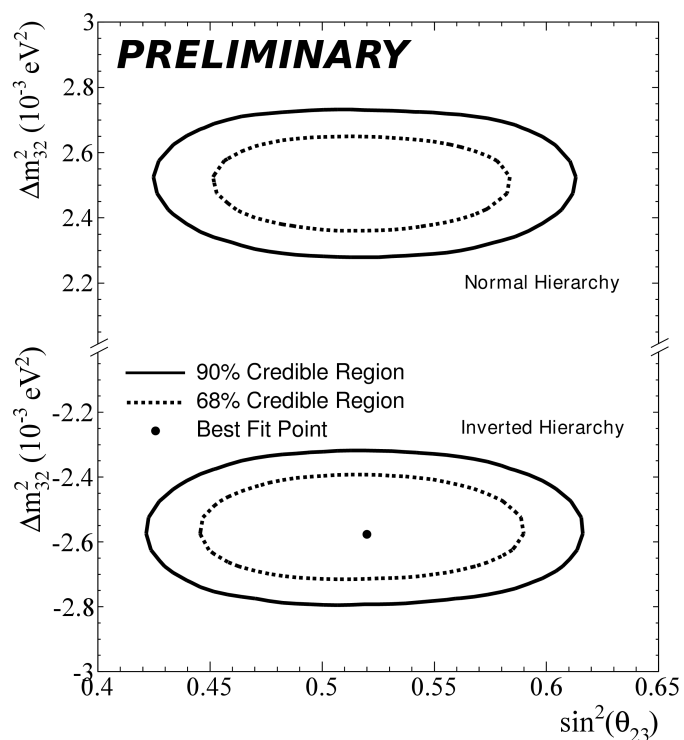
• >26.7
• 23.3-26.7
• 20.2-23.3
• 17.3-20.2
• 14.7-17.3
• 12.3-14.7
• 10.0-12.3
• 8.0-10.0
• 6.2-8.0
• 4.7-6.2
• 3.3-4.7
• 2.2-3.3
• 1.3-2.2
• 0.7-1.3
• 0.2-0.7
• < 0.2

Super-K

(c) Super-Kamiokande Collaboration



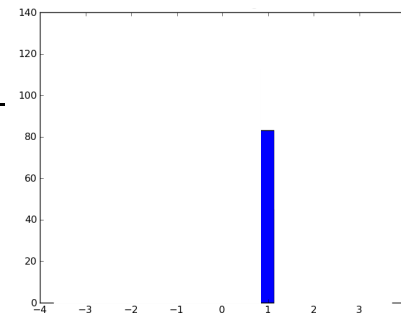
To
this:



see A.
Kaboth
talk for
more info
on T2K

Solution: Markov Chains.

$$p(X_0|D) = \frac{p(D|X_0) \times p(X_0)}{p(D)}$$



The chain is made of several steps.
Every step is a new point on the parameter space
and only depends on previous one.

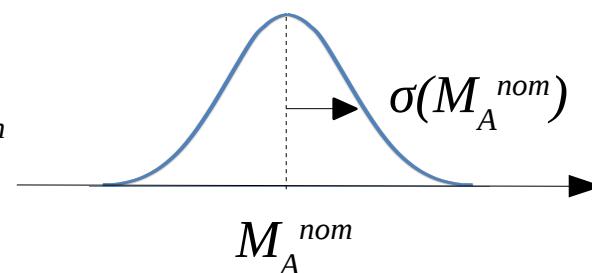
At each step the value of the parameter is changed in the MC
and the **posterior probability** $p(X_0|D)$
of the parameter is computed (Bayesian process).

Example : we want to determine M_A , for which we have
a prior value M_A^{nom} and systematic uncertainty $\sigma(M_A^{\text{nom}})$.

posterior probability :
$$p(M_A|D) = \frac{p(D|M_A) \times p(M_A)}{p(D)}$$

$$p(D|M_A) = \text{likelihood} = \frac{(N^{\text{predicted}} - N^{\text{data}})^2}{\sigma(M_A^{\text{nom}})^2}$$

$$p(M_A) = M_A^{\text{prior}} = \text{Gaussian of mean } M_A^{\text{nom}} \\ \text{and width } \sigma(M_A^{\text{nom}})$$



The **Metropolis-Hastings algorithm** ensures that the steps form a random walk sampling the posterior distribution.

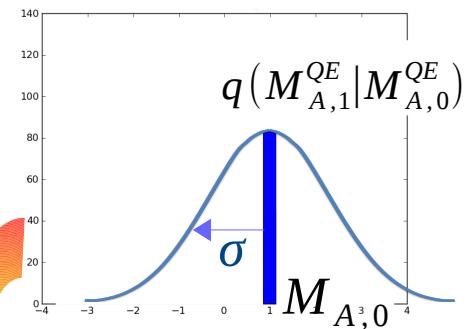
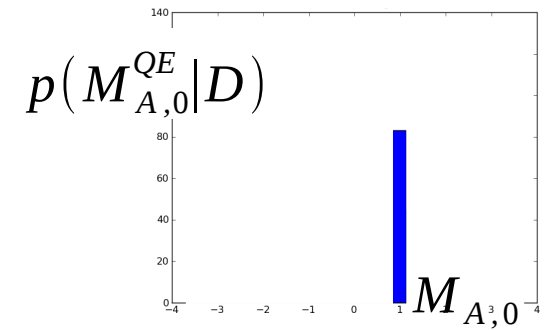
While at a step i , a proposal function $q(X_{i+1}|X_i)$ is used to propose the next step.

MaCh3 uses a Gaussian which width σ is the step size (tuned to maximise the efficiency of the chain).

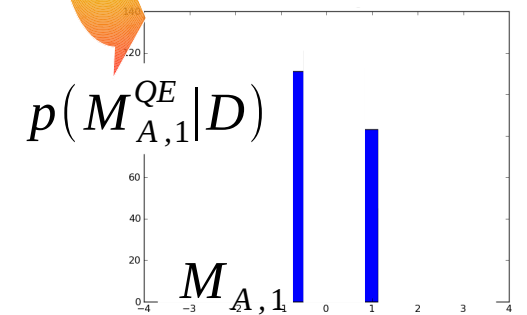
We define the **ratio** : $r = \frac{p(X_1|D)q(X_0|X_1)}{p(X_0|D)q(X_1|X_0)}$

- if $r \geq 1$ the step is accepted ;
- if $r < 1$ a random value U between $[0,1]$ is thrown and the step is accepted if $r > U$

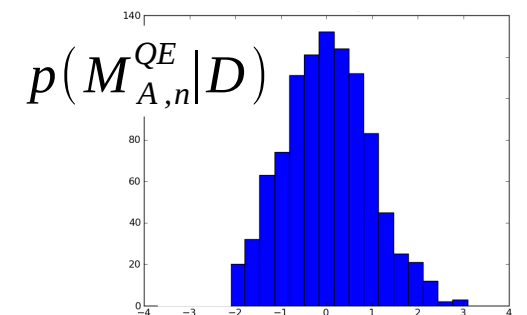
Distribution of steps is proportionnal to posterior probability of the parameter.



$r > 1$
or $r > U$

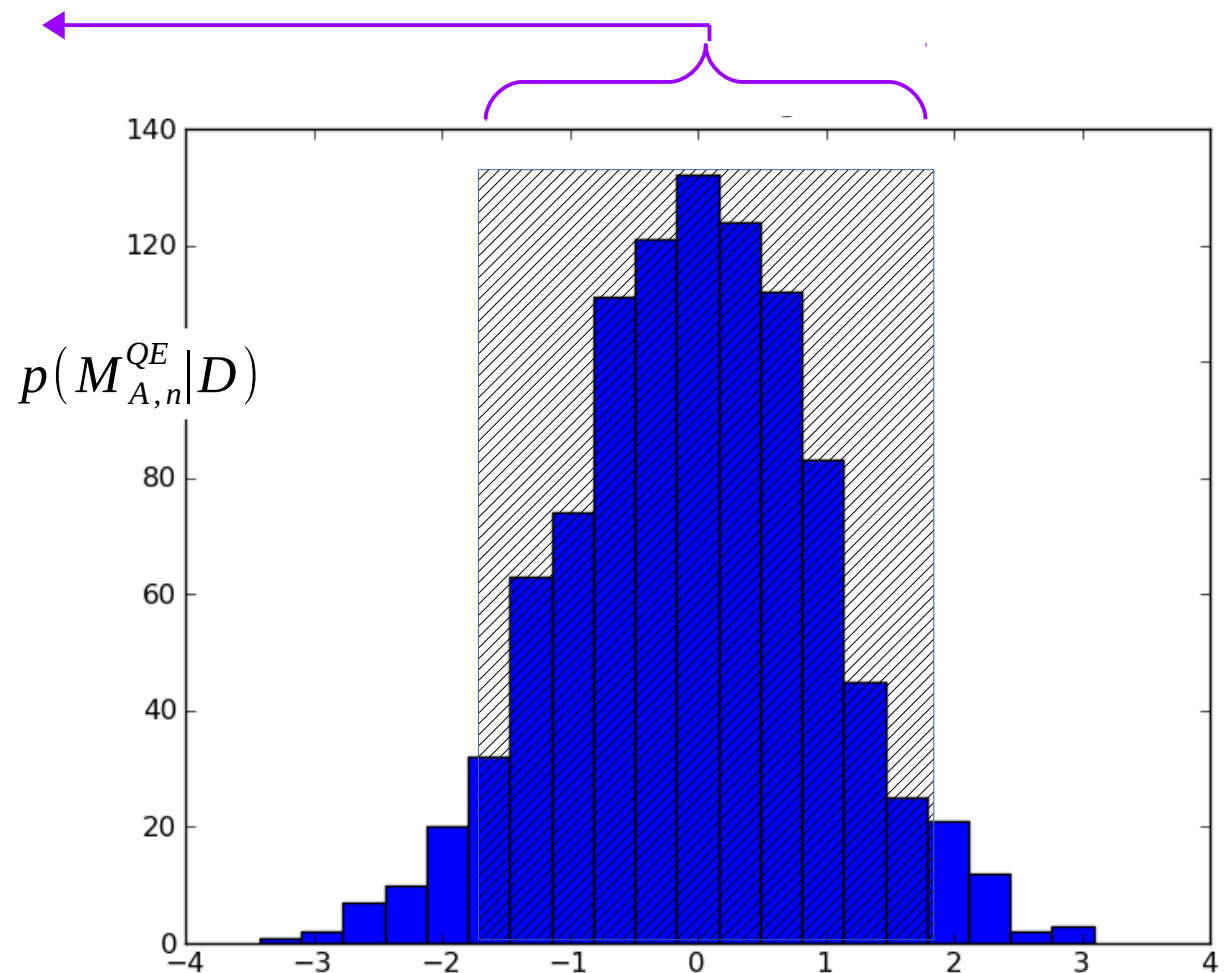


n-2 times more...



When the posterior probability density is found,
sum the **bins with most content** until integral = 68.3% for 1σ
95% for 3σ
... to give the desired credible interval

M_A^{QE} uncertainty range



come to see the poster
for T2K results !