

High-energy event reconstruction: FiTQun

Algorithm for Water Cherenkov detectors

Institut de Física
d'Altes Energies

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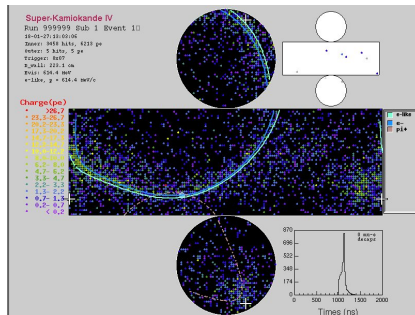
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Introduction to fitQun

- FitQun is a maximum likelihood estimation event reconstruction algorithm for WC experiments
- The algorithm is based on methods developed for the MiniBooNE experiment
 - additional features such as multi-ring reconstruction for events with multiple final-state particle

• FitQun steps:

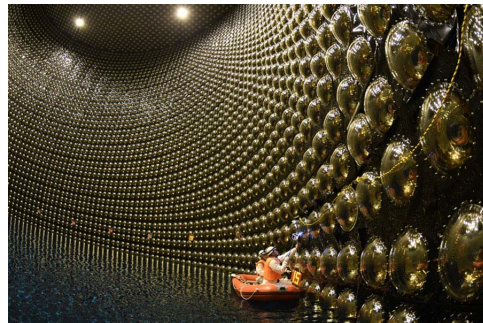
- 1 Vertex pre-fitting,
- 2 Hit clustering,
- 3 Single-ring reconstruction,
- 4 Multi-ring reconstruction.



The Likelihood Function

single ring event, i.e. an event with a single electron or a muon

- set of charges and times recorded for every PMT hit (integrated charge within time window)
- use of likelihood functions, in which a PDF is constructed each measurement
- likelihood also a function of the particle parameters specifying initial condition:
 - vertex position x ,
 - time t ,
 - zenith angle and azimuth of the direction θ, ϕ ,
 - and momentum p .
- obtained by searching for global maximum of likelihood function

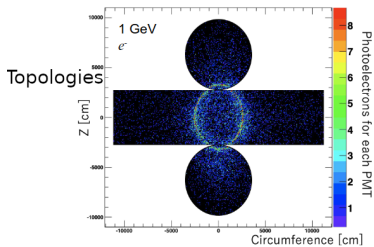
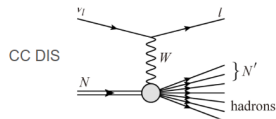
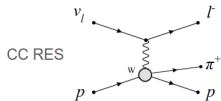
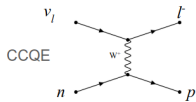


Maximum likelihood method

- designed to extract specific topologies Γ and determine the best set of kinematic parameters

HighE

Interaction Process



Super-Kamiokande IV

Run: 500000 Sub: 0 Event: 837

Time: 2015-03-03 00:00:00

Energy: 2075 MeV, 2174 pm

Trigger: 8437

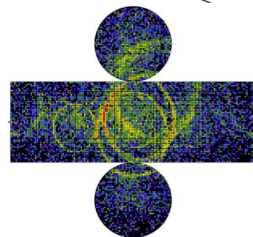
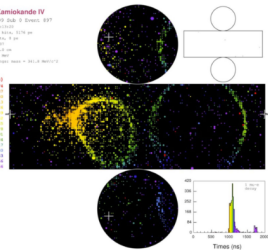
Algorithm: 002.0.0

Model: 002.0.0

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Time (ns)

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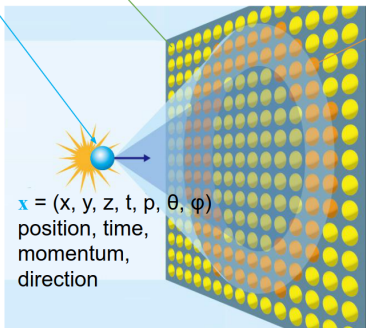


Likelihood-based reconstruction

$$L(\mathbf{x}) = \prod_j^{unhit} P_j(unhit|\mathbf{x}) \prod_i^{hit} P_i(hit|\mathbf{x}) f_q(q_i|\mathbf{x}) f_t(t_i|\mathbf{x})$$

Likelihood to maximise Candidate track hypothesis Probability of no hit at PMT Probability of hit at PMT Hit charge probability density Hit time probability density

Simultaneous fit of all 7 track parameters

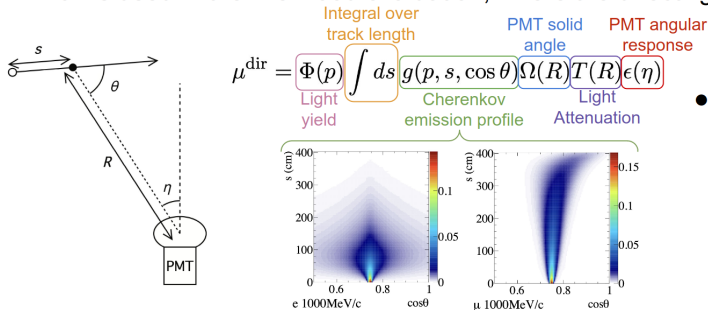


- For a given \mathbf{x} , a charge and time PDF is produced for every PMT

Calculation of the Predicted Charge from Direct Light

$$L(\mathbf{x}) = \prod_j^{\text{unhit}} P_j(\text{unhit}|\mu_j) \prod_i^{\text{hit}} \{1 - P_i(\text{unhit}|\mu_i)\} f_q(q_i|\mu_i) f_t(t_i|\mathbf{x})$$

- In practice, “predicted charge” is first calculated: $\mu = \mu^{\text{dir}} + \mu^{\text{sc}}t$ which is used in the likelihood evaluation, where the direct light contribution is:



- Particle ID information encoded here and extracted from likelihood comparison of different hypotheses

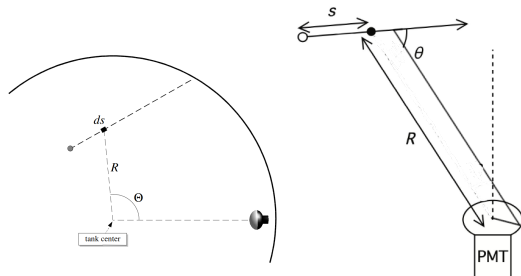
Calculation of the Predicted Charge from Indirect Light

(scattering, fluorescence, reflections)

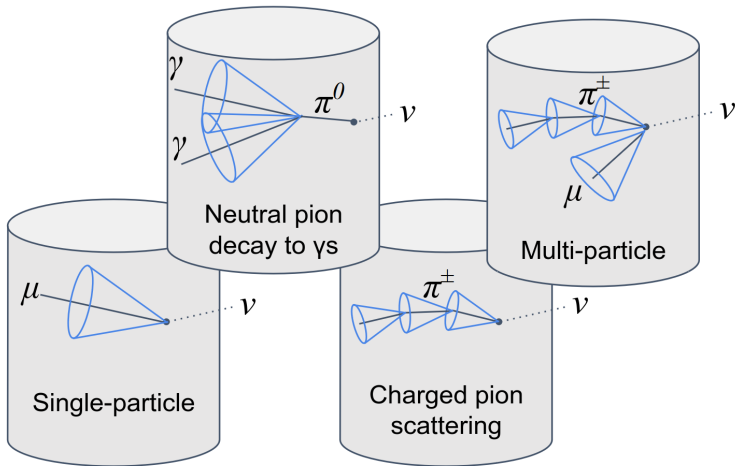
$$\mu^{sct} = \Phi(p) \int ds \frac{1}{4\pi} \rho(p, s) \Omega(R) T(R) \epsilon(\eta) A(s)$$

where $\rho(p, s) \equiv \int g(p, s, \cos \theta) d\Omega$ is the fraction of photons emitted per unit track length, at position s along the particle trajectory

- in Indirect light equation, photon emission described in Direct light equation is averaged over all directions at each point on the particle track



Vertices example

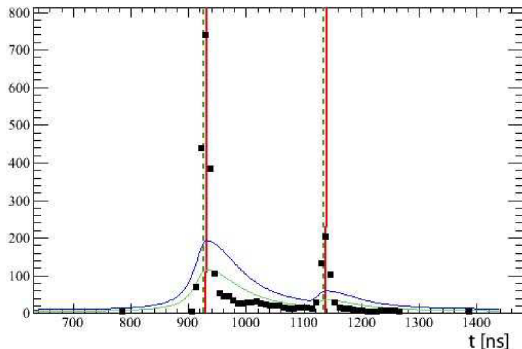


Vertex pre-fitting

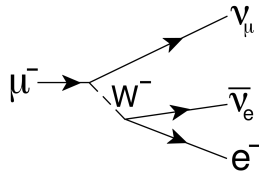
- Event reconstruction is done by searching for the global maximum of the likelihood function
- In practice, done by minimizing the negative log likelihood ($-\ln L$) by varying all the fit parameters simultaneously using MINUIT.
- PROBLEM: local minima of $-\ln L$ inevitably exist.
- Important to seed the fit parameters with values which are close to the global minimum
- The vertex pre-fitter is a fast algorithm which uses only the hit time information to estimate the vertex position and time

Sub-event algorithm

- Sub-events represent clusters of PMT hits separated in time from the 1st trigger
- Algorithm search for activity around 1st trigger by **fixing** vertex position x



- A MINUIT minimization of $-G(x, t)$ is performed

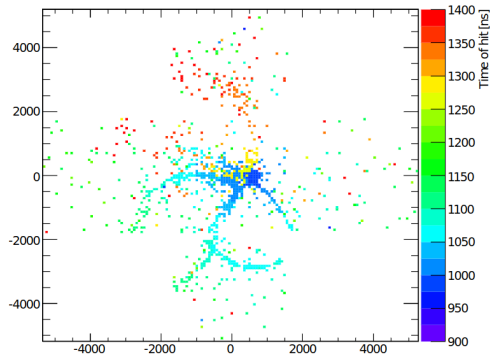
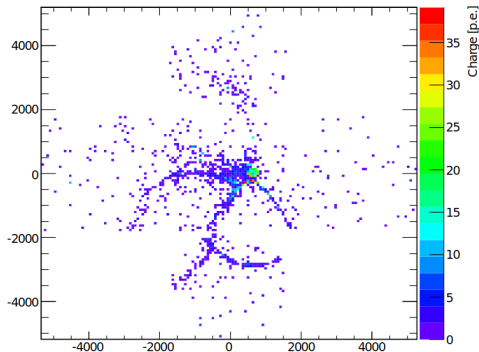


- Searching for the vertex position x and time t , which maximizes the vertex goodness defined as:

$$G(x, t) \equiv \sum_i^{\text{hit}} \exp(- (T_{\text{res}}^i / \sigma)^2 / 2)$$

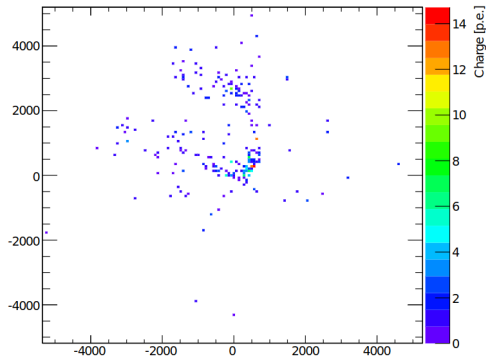
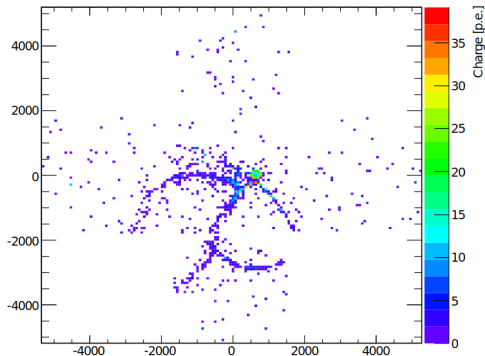
Assumption broken

Assumption “vertex positions close to the pre-fit vertex” is broken when the primary particle travels a significant distance from the interaction vertex, as for high momenta muons



Masking hits

Therefore, the vertex pre-fitting and peak-finding algorithm are rerun after masking the hits caused by the primary particle to improve decay electron reconstruction efficiency

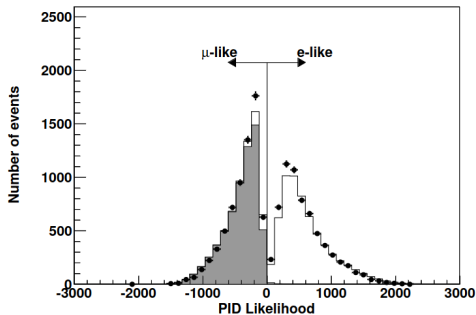


The single-ring fitter

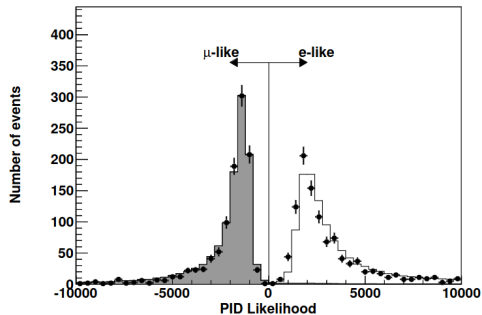
- poses single-particle hypotheses for the likelihood function
- three types of single-ring hypothesis are considered in fitQun
 - 1 electron
 - 2 muon
 - 3 charged-pion
- the kinematic parameters of the event are varied to maximize the likelihood function against the observation
- Particle identification (PID) is based on the best-fit likelihood values for each of these hypotheses

PID likelihood distribution single-ring

Electrons and muons, for example, are separated by cutting on $\ln(L_e/L_\mu)$, the logarithm of the likelihood ratio between the best-fit electron and muon hypotheses



(a) Sub-GeV events



(b) Multi-GeV events

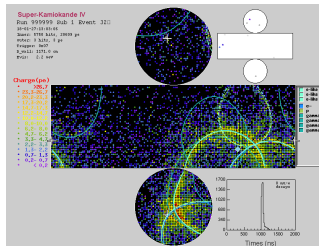
PID results

Summary of the basic performance of fitQun reconstruction algorithms on the fully contained CCQE single ring event sample with visible energy of 1 GeV

Reconstruction	True CCQE ν_e sample	True CCQE ν_μ sample
Vertex Resolution	20.64 cm	15.83 cm
Direction Resolution	1.48°	1.00°
Momentum Bias	0.43%	-0.18%
Momentum Resolution	2.90%	2.26%
Mis-PID rate	0.02%	0.05%

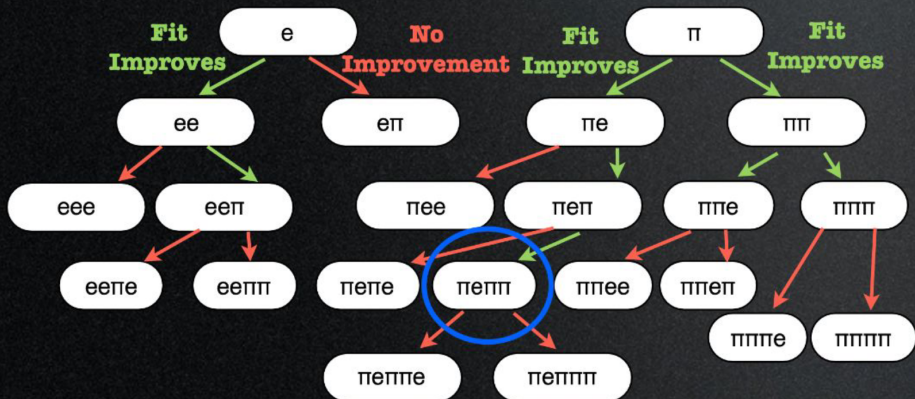
Multi-ring reconstruction

- a large fraction of events with multi-GeV energies have multi-particle final state
- is applied only to the time window around the primary event trigger (to save computing time)
- starts by performing an iterative search for an additional ring on top of any existing rings
- likelihood equation is updated to include a new ring and minimized again allowing the kinematic parameters for the rings to vary
- Three hypotheses rings are tested:
 - 1 e-like
 - 2 μ -like
 - 3 π^+ -like
- iterates until either a newly added ring fails the likelihood criterion or six rings are found



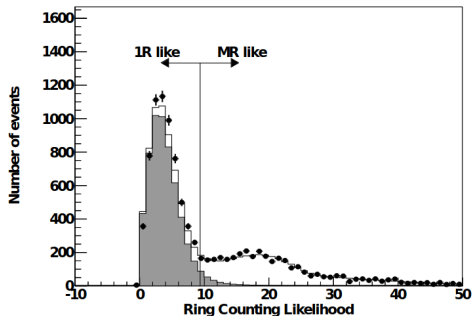
Multi-ring Reconstruction

Sample Fit Sequence

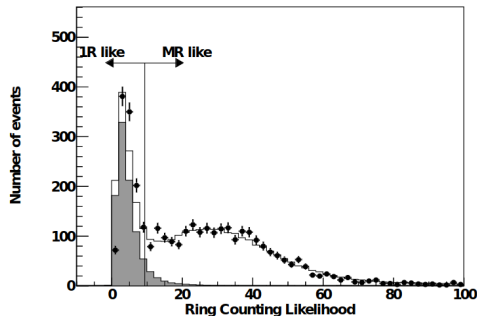


Distribution of the likelihood ratio between the best-fit single-ring hypothesis and multi-ring hypothesis

cut at 9.35 for e-like, 11.83 for μ -like



(a) Sub-GeV events



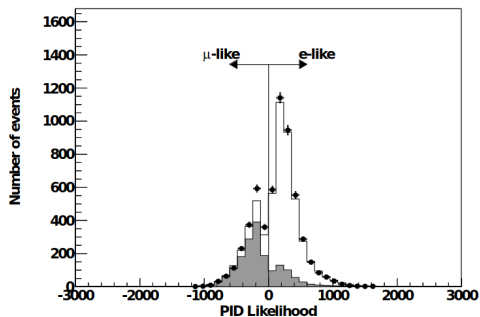
(b) Multi-GeV events

Ring counting performance

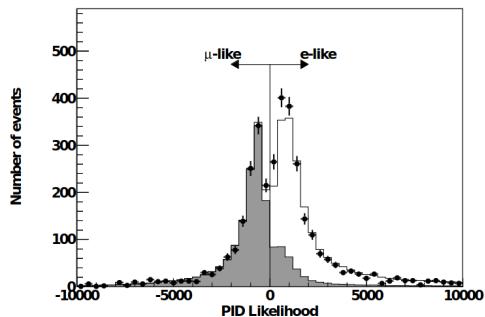
- Angular separation of less than 20° from the most energetic ring discarded
→ particle scattering
- The two rings are merged and refit as one for all particle hypotheses

True Number of rings	Reconstruction		
	1R	2R	$\geq 3R$
True 1R	95.0%	4.64%	0.41%
True 2R	27.8%	66.7%	5.56%
True $\geq 3R$	7.04%	25.5%	67.5%

PID likelihood variable distribution of the most energetic ring in fully contained multi-ring events



(a) Sub-GeV events

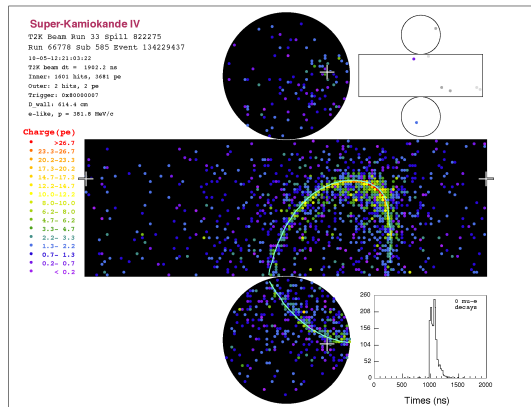
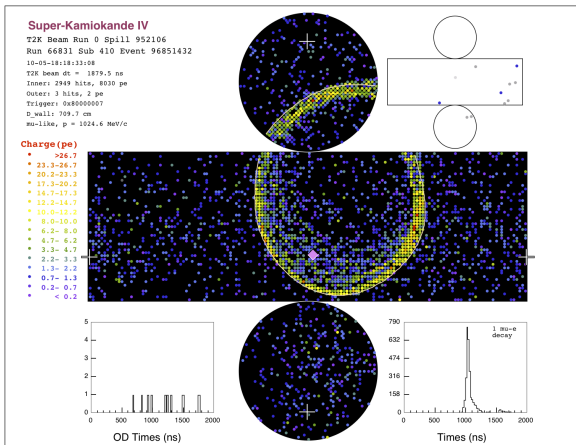


(b) Multi-GeV events

Conclusion

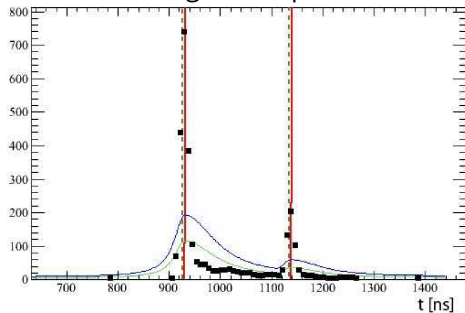
- Reconstruction algorithm for events at Super-K
- FiTQun steps:
 - ① Vertex pre-fitting,
 - ② Hit clustering,
 - ③ Single-ring reconstruction,
 - ④ Multi-ring reconstruction.
- fiTQun is being tuned for HK and WCTE at the moment
- reach limit of the achievable reconstruction precision
- to improve, more complex likelihood function would be required (relaxing assumptions), but would result in increased computational complexity
- alternatives to improve:
 - ML
 - hybrid reconstruction method using ML generated likelihoods with fiTQun-like reconstruction algorithms
- Multi-Vertex fiTQun developed by Matsumoto-san

Thank you



Back-up: Peak Finder

- Peak finder searches for sub-events by fixing vertex position x at the value the vertex pre-fitter returned, and scanning the goodness while varying the time t
 - Assuming vertex positions close to the pre-fit vertex



Peak is defined as first local maximum scan point which lies above blue curve

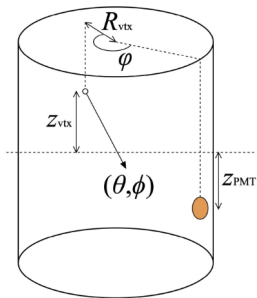
- Threshold curve $F(t)$ defined as

$$F(t) \equiv 0.25 \max_{i \in M} \left\{ \frac{G(x, t_i)}{1 + ((t - t_i)/\gamma)^2} \right\} + \eta$$

$$\text{with } \gamma = \begin{cases} 25\text{ns} & \text{for } t < t_i \\ 70\text{ns} & \text{for } t > t_i \end{cases}$$

- M represents all local maxima of $G(x, t)$
- Offset $\eta = 9$ added to the threshold function to suppress effect of dark hits

Back-up: The indirect light contribution



$$\mu^{\text{sct}} = \Phi(p) \int ds \frac{1}{4\pi} \rho(p, s) \Omega(R) T(R) \epsilon(\eta) A(s)$$

$$\rho(p, s) \equiv \int g(p, s, \cos \theta) d\Omega$$

$$A(s) = A(x_{\text{PMT}}, z_{\text{vtx}}, R_{\text{vtx}}, \varphi, \theta, \phi) \equiv \frac{d\mu^{\text{sct}}}{d\mu^{\text{iso,dir}}}$$

- Assuming direction-averaged Cherenkov profile
- Scattering table derived from uniformly distributed, isotropic low energy electrons