

Seminar on Particle and Astrophysics

Universität Zürich, May 17, 2006

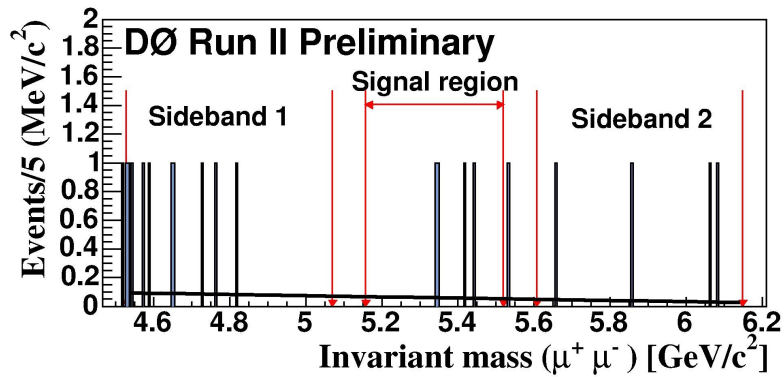
# Tracking In High Multiplicity Environments

Olaf Steinkamp

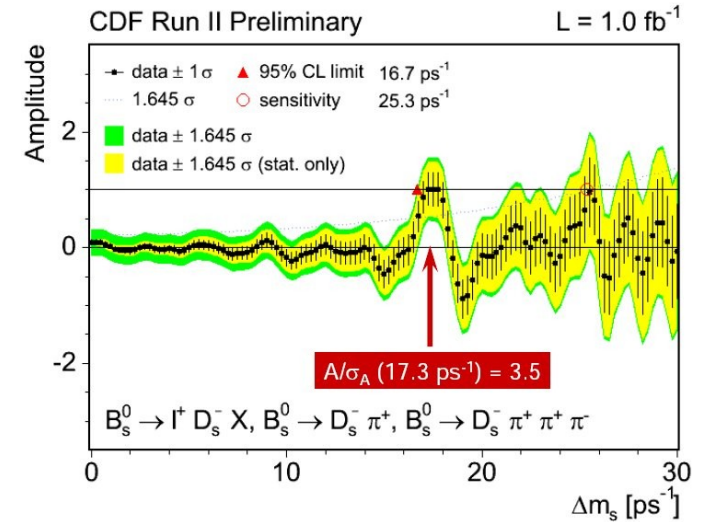
Physik-Institut der Universität Zürich  
Winterthurerstrasse 190 CH-8057 Zürich  
[olaf.steinkamp@physik.unizh.ch](mailto:olaf.steinkamp@physik.unizh.ch)



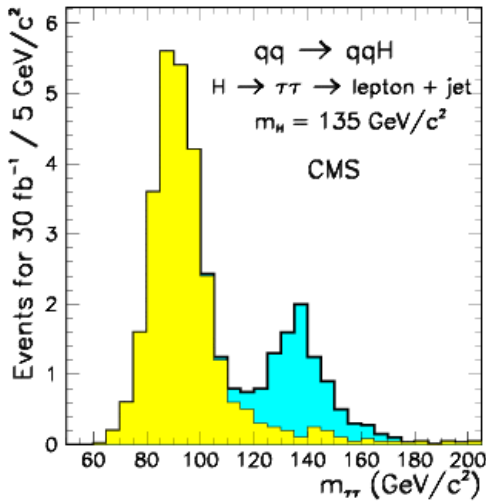
# Tracking Is Everywhere



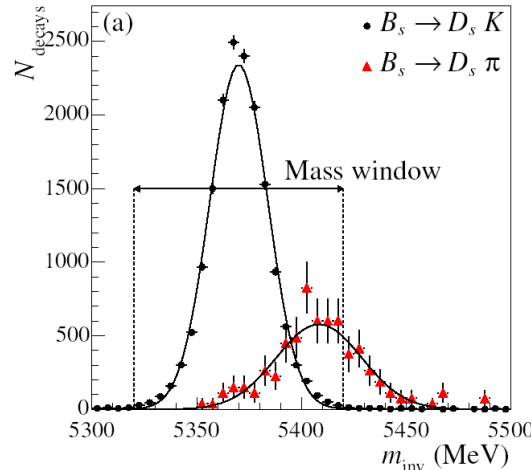
**DØ upper limit on  $B_s \rightarrow \mu\mu$   
invariant mass resolution**



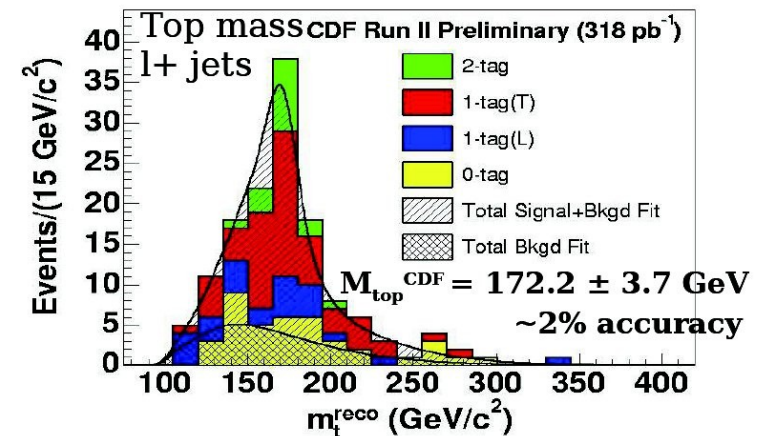
**CDF measurement of  $B_s$  oscillations:  
 $B_s$  momentum and decay length**



**CMS simulation of  $H \rightarrow \tau\tau$   
 $\tau$  jet,  $\tau$  lifetime tagging**

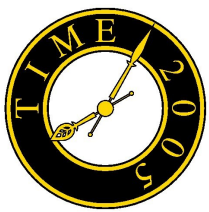


**LHCb simulation of  
 $B_s \rightarrow D_s K$  and  $B_s \rightarrow D_s \pi$   
invariant mass resolution**



**CDF measurement of top mass:  
tracking in jets, b tagging**





# Tracking at the LHC

ATLAS/CMS ( $L = 10^{34} \text{ cm}^{-2}\text{s}^{-1}$ )

~ 25 pp interactions per BX

~ 2000 charged tracks

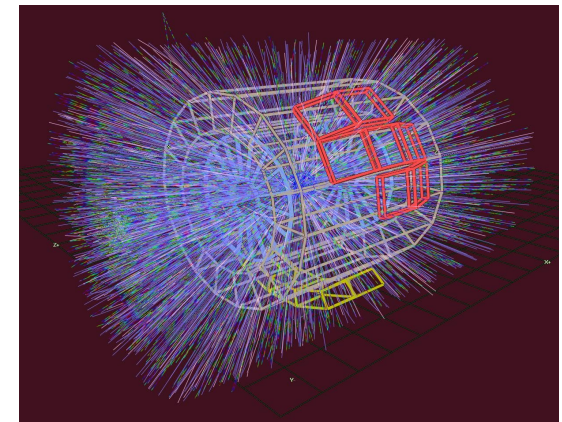
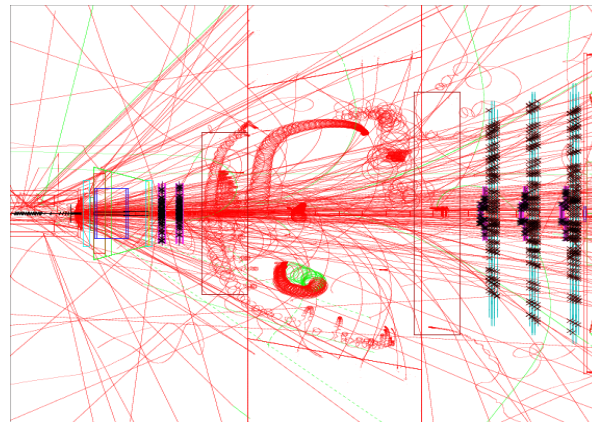
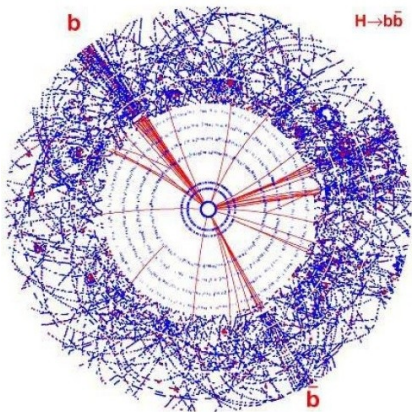
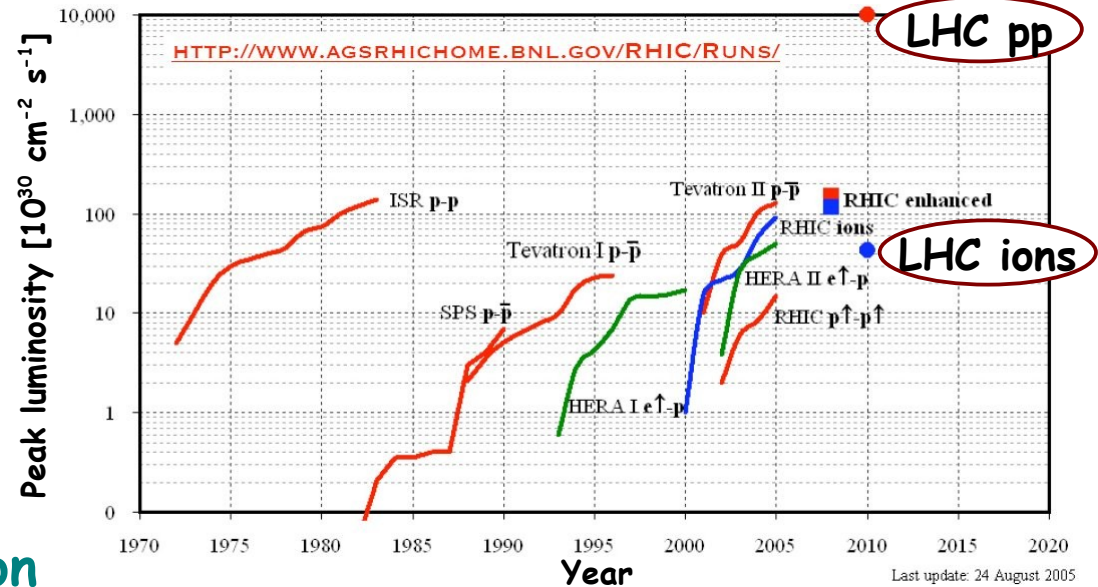
LHCb ( $L = 2 \times 10^{32} \text{ cm}^{-2}\text{s}^{-1}$ )

~ few pp interactions per BX

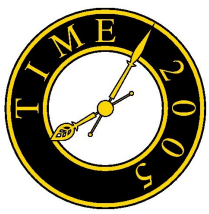
~ 100 charged tracks, mostly

concentrated in forward direction

ALICE (heavy-ions,  $L = 2 \times 10^{31} \text{ cm}^{-2}\text{s}^{-1}$ ):  $dN_{ch}/dn \sim 1500 - 6000$



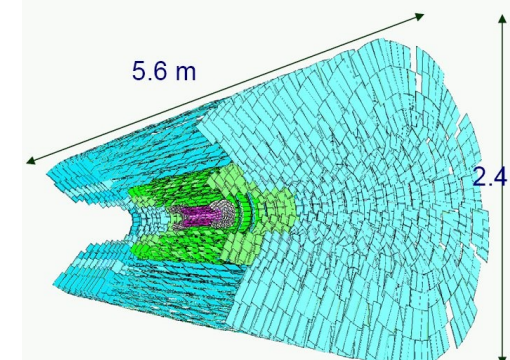
=> a daunting environment for detectors and reconstruction algorithms



# Detectors

## High track densities require fine readout granularity, e.g. CMS tracker

- pixel detector: 800 modules, 12k chips, 50M channels
- silicon tracker: 15k modules, 100k chips, 10M channels
- huge challenge to build, commission and maintain, some failures almost unavoidable (-> examples later)

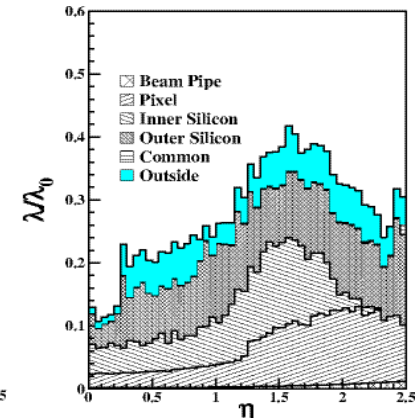
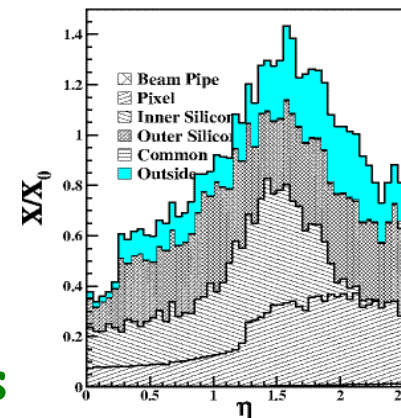


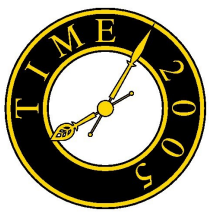
## Large particle fluences mean high radiation load, e.g. ATLAS tracker

- ionizing dose up to 50 MRad/year
- non-ionizing energy loss up to equiv.  $3 \times 10^{14}$  1-MeV neutrons /  $\text{cm}^2$  / year
- mobile phone would survive  $\sim 1$  sec

## LHC bunch-crossing frequency of 25 ns requires fast readout electronics:

- power consumption -> cooling -> material
- $X_0$ : multiple scattering, energy loss
- $\Lambda_0$ : hadronic interactions, "loss" of particles





# Reconstruction Algorithms

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Large number of tracks means large number of hits to process:

- computing time is an issue (especially for trigger applications)
  - need clever pattern recognition algorithms to limit combinatorial loops
  - need clever caching to gain fast access to relevant data
- ultimately: compromise between computing time, efficiency and purity

High track density can mean overlapping hits or clusters of hits, imperfect detectors mean noise hits and inefficiencies:

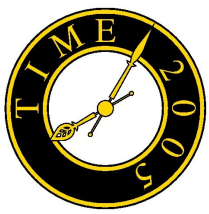
- need very good understanding of detector performance to minimise effect on reconstruction efficiency and resolution

Detector material means multiple scattering and energy loss:

- need good understanding (and description) of material distribution
  - to optimise search windows during pattern recognition
  - to optimise use of information in track fits

**=> interaction between hardware people and software people crucial !**





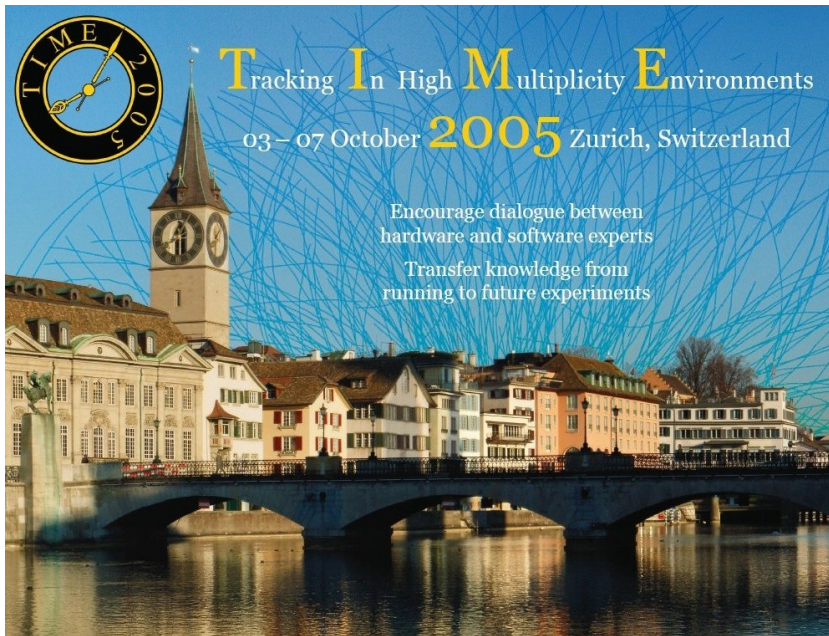
# Standing on the Shoulders of Giants ...

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Earlier experiments had to face "similar" challenges:

- H1 and ZEUS at HERA (ep), HERA-B (pA)
- D0 and CDF at the Tevatron ( $p\bar{p}$ )
- Heavy ion experiments at RHIC and the SPS

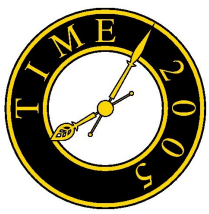
=> learn from the experience made in these experiments



Workshop on  
**Tracking In High Multiplicity Environments**  
Zürich, October 3-7, 2005

Encourage dialogue between  
hardware and software experts

Transfer knowledge from  
running to future experiments



# TIME '05

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10 invited speakers, 44 presentations, 52 participants, a.o. from

- ATLAS, CMS, LHCb, ALICE, P236, CBM
- CDF, D0, H1, HERA-B, STAR, PHOBOS

## Topics covered:

- operational experience
- tracking algorithms
- tracking and vertexing
- tracking and triggering
- alignment algorithms
- radiation hardness / ageing
- new detector technologies

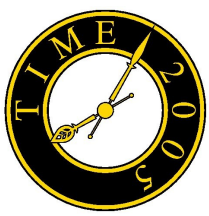


## Programme and slides:

- <http://www.physik.unizh.ch/time05>, proceedings to be published in NIM A

Organisation: R. Bernhard, J. Gassner, F. Lehner, M. Needham, O.S., U. Straumann, A. Vollhardt

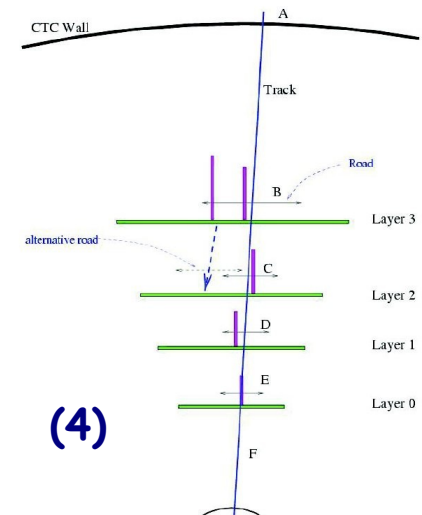
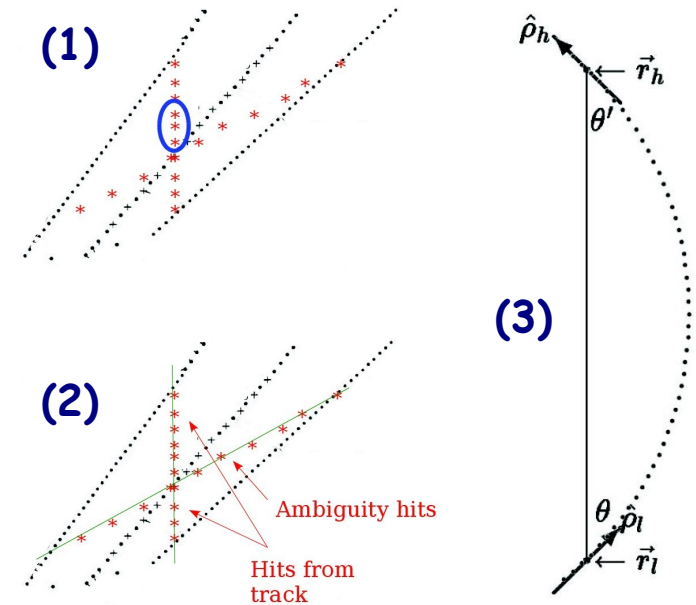
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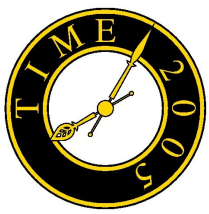
# CDF Experience

Run I (1992-1995, up to  $2 \times 10^{31} \text{cm}^{-2} \text{s}^{-1}$ ):

- CTC: Central Tracking Chamber
  - jet chamber geometry with 8 superlayers
- VTX: drift chamber for z measurement
- SVX: 4 layers of silicon strip detectors
- main tracking algorithm:
  - seeding in CTC superlayers (1,2)
  - linking of CTC track segments (3)
  - extrapolation into SVX, pick up hits (4)
- tracking at high luminosity suffered from
  - lack of standalone tracking capability in silicon
  - too few silicon layers, none at large radius
  - lack of 3D measurement in silicon



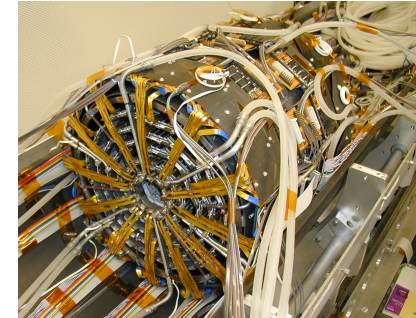
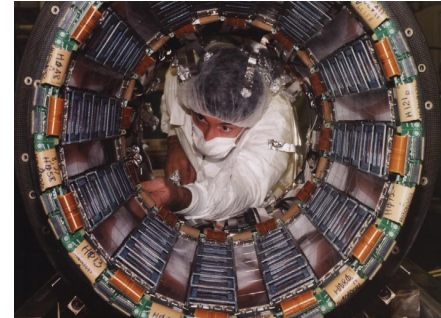
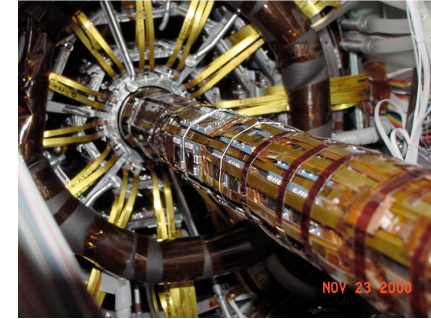
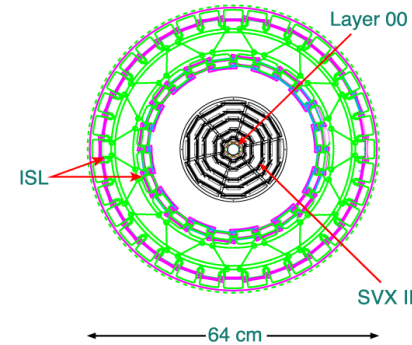




# CDF Experience

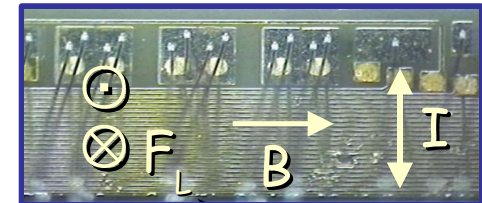
## Run II (since 2002, up to $2 \times 10^{32} \text{cm}^{-2} \text{s}^{-1}$ )

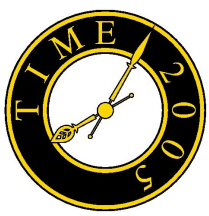
- learn from experience gained in Run I
  - 8 layers of silicon (L00, SVXII, ISL)
  - outermost layer at  $r = 32 \text{ cm}$
- add complementary tracking strategies
  - standalone silicon tracking,
  - extrapolation to COT (replaced CDC)
  - silicon seeding for displaced tracks, ...



## A large and complicated system -> long commissioning phase

- high re-work rate on SVX ladders (double-sided silicon)
- blocked cooling pipes, breaking of wire bonds in magnetic field, radiation-induced power supply failures, ...
- now ~ 92% of ladders operational, 85% of ladders with < 1% error rate
  - > continuous and significant effort required to maintain this level

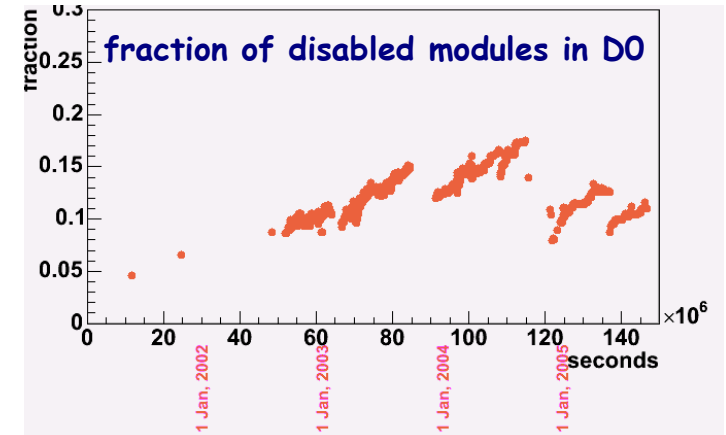




# Silicon Experience

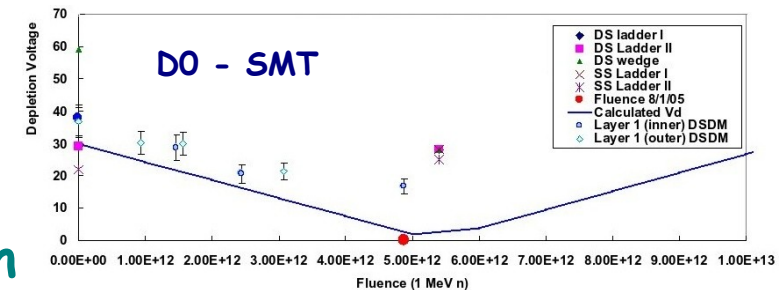
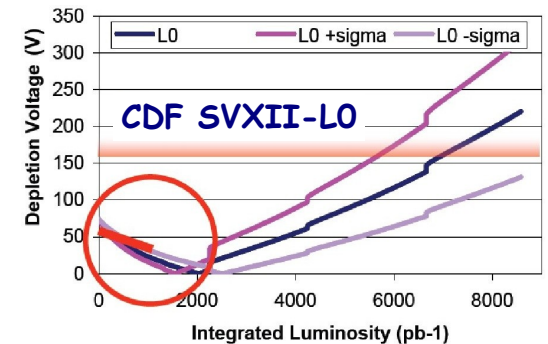
## Similar experience in other experiments

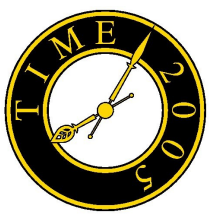
- D0: typically ~ 10% of ladders disabled
- STAR SVT (38 ladders):
  - beginning of runIII ~10% bad channels
  - at end of runIV ~ 16% bad channels



## Good news: radiation damage seems well understood and predictable

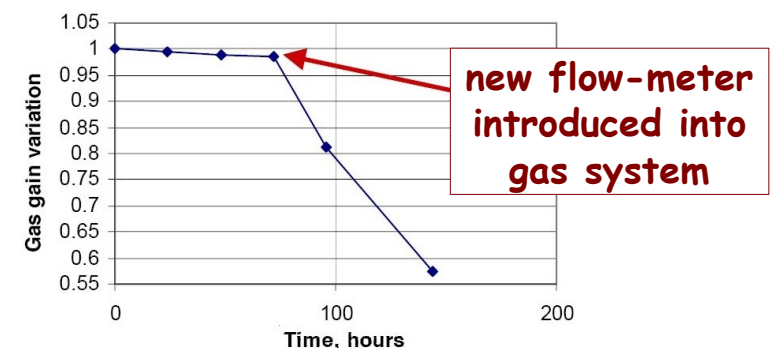
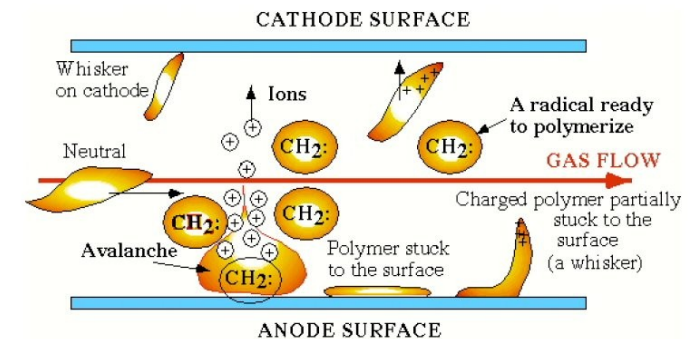
- main worry: defects in silicon lattice caused by NIEL
- additional energy levels in band gap
  - causes increase of sensor leakage current
  - compensate by operating at low temperature
- change of effective doping concentration
  - causes change of full depletion voltage
  - ultimately limits lifetime of detector
- observation so far follows optimistic prediction





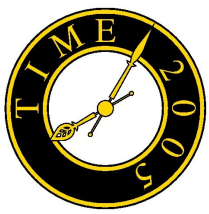
# Wire Chamber Ageing

- “Classical” ageing: gain loss due to formation of deposits on anode wires
- often parametrised as function of accumulated charge per cm wire length
  - at LHC expect  $\sim 1$  C/cm per year (past experiments typically 10 mC/cm)
- extensive R&D programs, e.g. at CERN, comparison with plasma chemistry
- better qualitative understanding of process:
  - production of radicals in avalanche ( $\text{CH}_2$ )
  - polymerisation, condensation on electrodes
- long list of “do's and dont's”: gas mixtures, construction materials, assembly procedures
- but: many factors involved and minor changes can cause huge effects
- ageing tests mandatory but never conclusive



“However, despite all precautionary measures, the final answer on the radiation hardness of a detector will always have to come from the experiment.” (C.Niebuhr, proc. TIME'05)

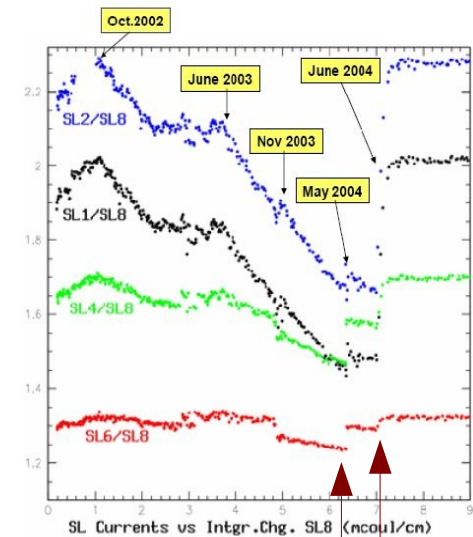
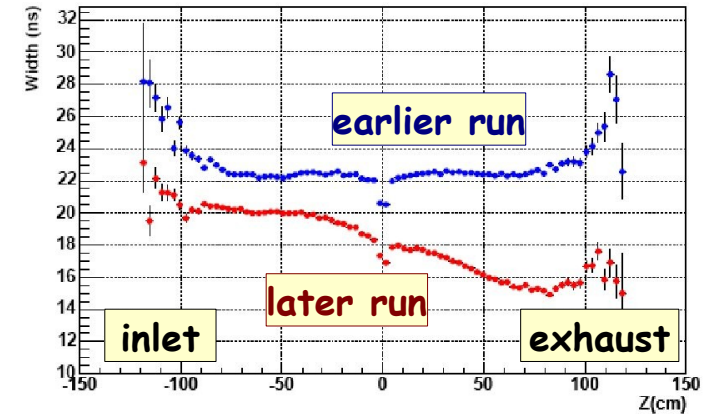


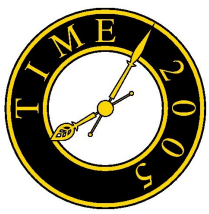


# Example: CDF-COT

## Central Outer Tracking chamber, newly installed for RunII:

- Argon/Ethane 50/50 with 1.7% Iso-propanol
- Oct/Nov 2003: definite evidence for ageing
  - gain reduction in inner vs outer layers
  - more pronounced at gas exhaust than at inlet
  - more pronounced below beam pipe than above
- evidence for deposits, mainly C and H, chemical bonds mainly CH and CC
  - increase gas-flow to remove radicals more quickly ?
  - increase temperature to inhibit condensation ?
  - change of gas mixture (e.g. Ar/CO<sub>2</sub>, Ar/CF<sub>4</sub>) ?
- (accidental) addition of oxygen during maintenance
  - observe rapid and complete recovery of gas gain
- hypothesis: O<sub>2</sub> combines with CH<sub>2</sub>, inhibits polymerisation
- now running with 100 ppm of O<sub>2</sub>, no evidence for ageing since





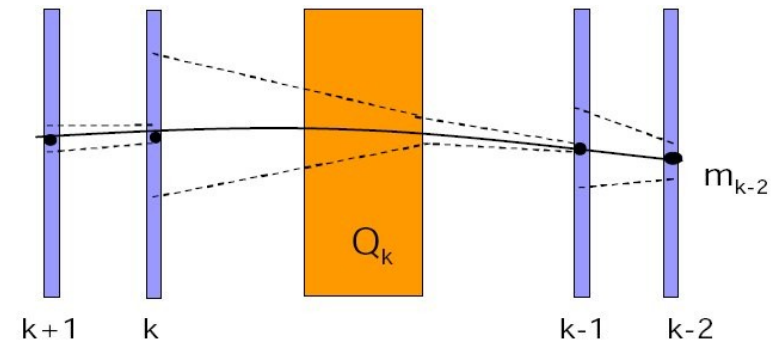
# Track Finding

Global methods: find all tracks in parallel, use all hits at the same time

- histogramming methods (e.g. Hough transform)
- neural nets (e.g. Hopfield network), cellular automata

Local methods: find tracks sequentially, using subsets of hits (need a seed)

- track road, track following
- Kalman Filter: recursive method for simultaneous track finding and fitting
  - alternating propagation and update steps, starting from a track seed
  - use current knowledge of track parameters to propagate candidate to next layer
  - search for compatible hits in that layer, add the closest hit ( $\chi^2$ ) to the candidate
  - update track parameters and iterate
  - very popular but as such not good enough for high track density





# Extensions of Kalman Filter

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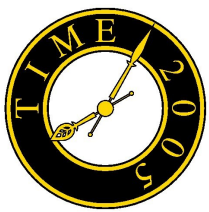
Combinatorial Kalman Filter: build up a tree of candidates for each seed

- starting from a set of seeds, extrapolate all candidates to the next layer
- for each candidate, create a new “branch” with each compatible hit
  - in addition, create one branch with a missing hit (inefficiencies)
- cleanup after each iteration: drop branches with too many missing hits, or too bad overall  $\chi^2$ , and branches that are subsets of other branches
- final cleanup: select the best branch for each seed ( $\chi^2$ , number of hits)

Adaptive Filters: introduce competition between the candidates

- same basic strategy and cleanup procedure as for CKF
- define for each candidate  $i$  and hit  $j$  a weight  $w_{ij} = \frac{\exp(-\chi_{ij}^2/2)}{\sum_j \exp(-\chi_{ij}^2/2) + \exp(-\chi_{cut}^2/2)}$
- “hard” assignment: accept hits with  $w_{ij}$  above a cut
- “soft” assignment: apply cut on  $w_{ij}$  and use  $w_{ij}$  as a down-weighting factor





# Extensions of Kalman Filter

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Deterministic Annealing Filter: iterated Kalman Filter with annealing

- do not build candidate tree but use all hits compatible with extrapolation
- initialise all hits with a low weight and set an initial temperature  $T$
- then iterate:
  - forward filter, using current weights
  - backward filter, using current weights
  - form weighted mean of forward and backward filter ("smoother")
- at each detection layer, calculate compatibility  $\chi_j^2$  of hit  $j$  with the smoothed track candidate and update the current weights according to

$$w_j = \frac{\exp(-\chi_j^2/2T)}{\sum_j \exp(-\chi_j^2/2T) + \exp(-\chi_{cut}^2/2T)}$$

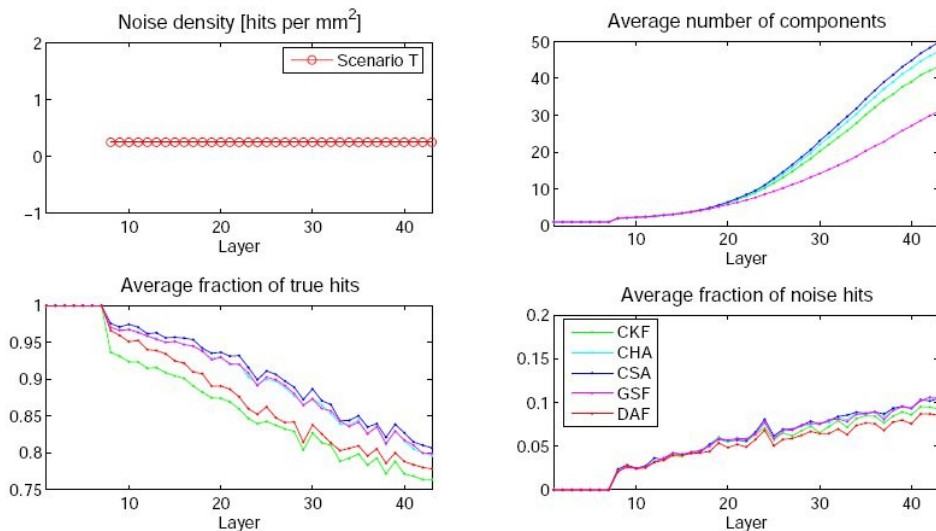
- after each iteration, lower the temperature  $T$
- stop after a few iterations with temperature  $T = 1$



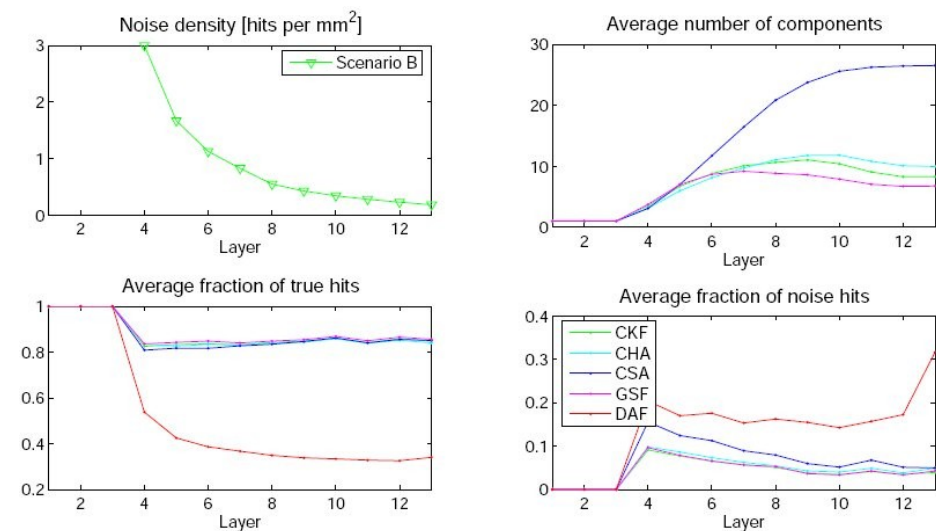
# Comparison of Methods

## Series of simulation experiments: (Frühwirth and Strandlie)

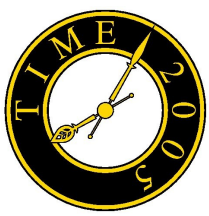
- two toy experiments, similar to CMS tracker and ATLAS Inner Detector
  - magnetic field, detection layers, resolutions and material budget
- generate 2500 events:
  - one track with  $p_T = 10$  GeV plus "noise" hits to simulate underlying event
  - various scenarios for density distribution of noise hits
- just two out of many examples:



**ATLAS: seeds from 7 silicon layers**



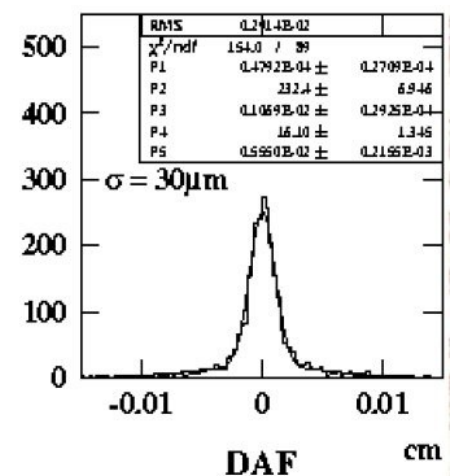
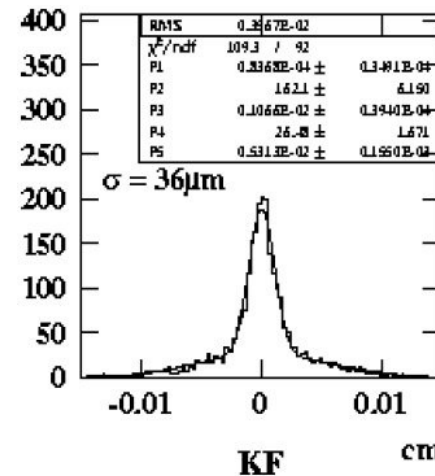
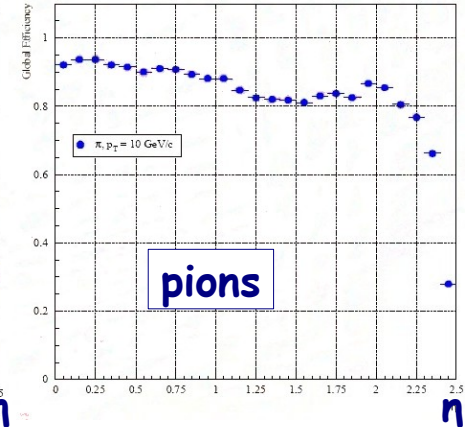
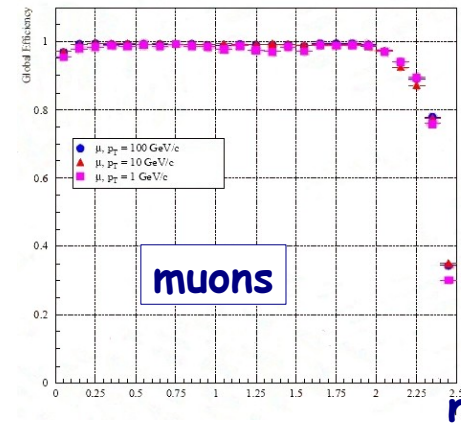
**CMS: seeds from 3 pixel layers**



# CMS Tracking Study

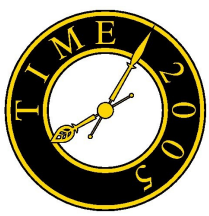
## Combinatorial Kalman Filter in Silicon Tracker (seeds from Pixels)

- efficiency close to 100% for muons
- but only 80-90% for pions
  - due to hadronic interactions
  - 10-20% of pions disappear before leaving 8 hits in Silicon Tracker
- efficiency in high-density environment (e.g. core of 100 GeV/c jet) close to single-track efficiency (within few %)
- but under extreme conditions observe significant gain from fancier methods
  - example:  $\tau$ -jets from  $H^0 \rightarrow \tau^+\tau^-$
  - Combinatorial Kalman Filter (KF)
  - Deterministic Annealing Filter (DAF)



Transverse impact-parameter resolution

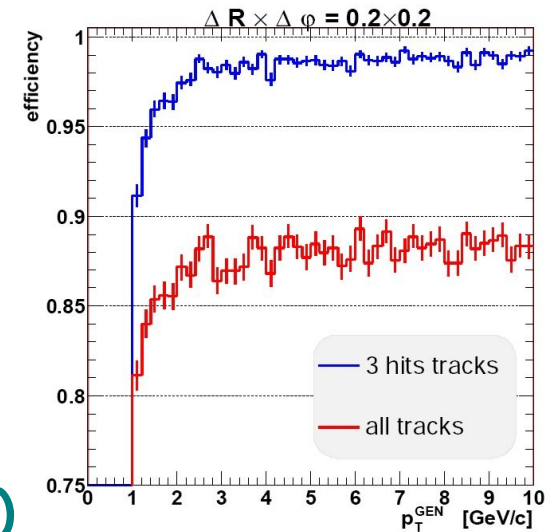
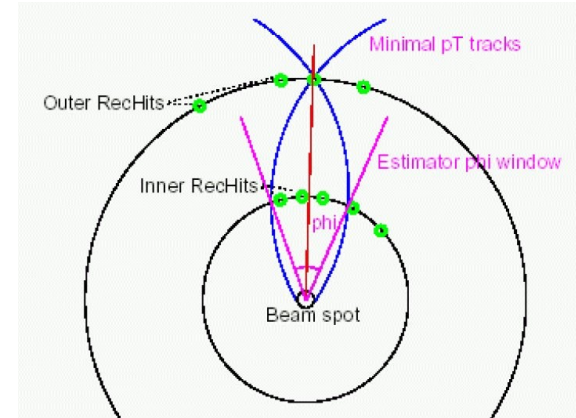




# CMS Tracking Study

Seeding: based on triplet-search in three Pixel layers (at  $r = 4, 7, 10$  cm)

- demand compatibility with interaction region
  - typically 1-2 mm in radius,  $\pm 15$  cm in  $z$
- demand minimum transverse momentum
  - defines search window in azimuthal angle  $\varphi$
- demand that within  $\eta$  acceptance
  - defines search window in  $r/z$
- three 3D points: determine all 5 track parameters
- close to 100% efficiency if track has three hits
- but: 10% of tracks leave hits in only two layers
  - purely due to geometrical acceptance
  - detector inefficiency not taken into account
- to recover these 10%, have to do doublet search
  - very CPU intensive (20-30.000 pairs at  $10^{34} \text{ cm}^{-2} \text{ s}^{-1}$ )
  - worse quality seed: track parameters much less well constraint

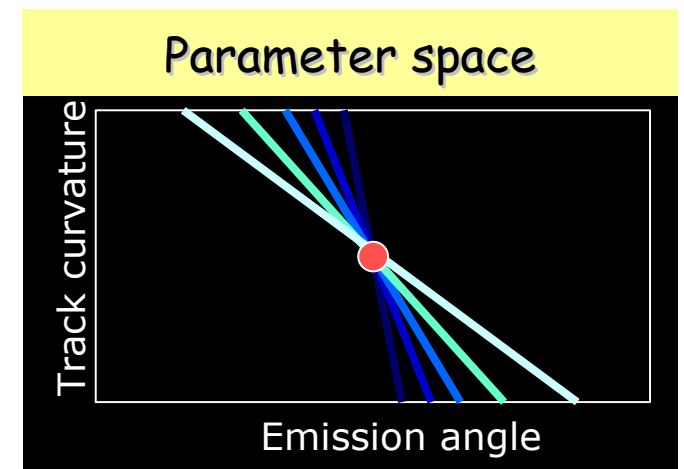
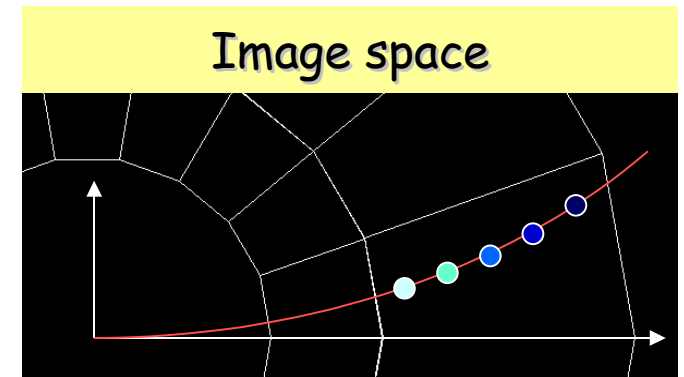


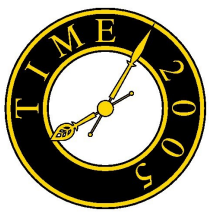


# Hough Transform

## Global histogramming method:

- transform hit information from "image space" (measured positions) to "parameter space" (track parameters compatible with hit positions)
- hits belonging to the same track form clusters in the parameter space
- binning of parameter space -> histogram
- find peaks in histogram -> track candidates
- bin size determines efficiency / resolution but also computing time
- advantage: fast and highly parallelisable -> ideal for trigger applications
- limitation: fast only if parameter space one- or two-dimensional -> only very simple track models (e.g. straight line or circle)

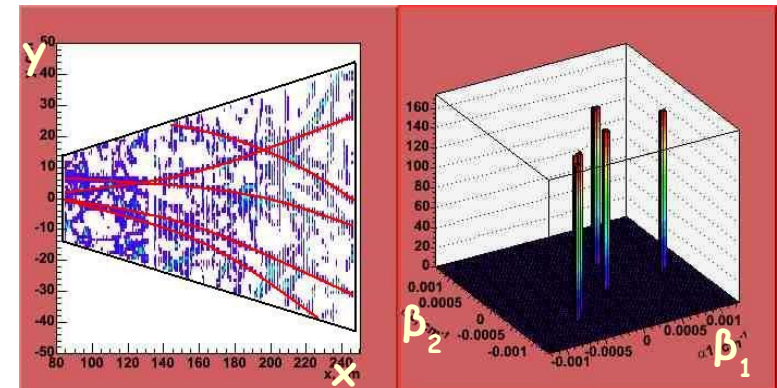
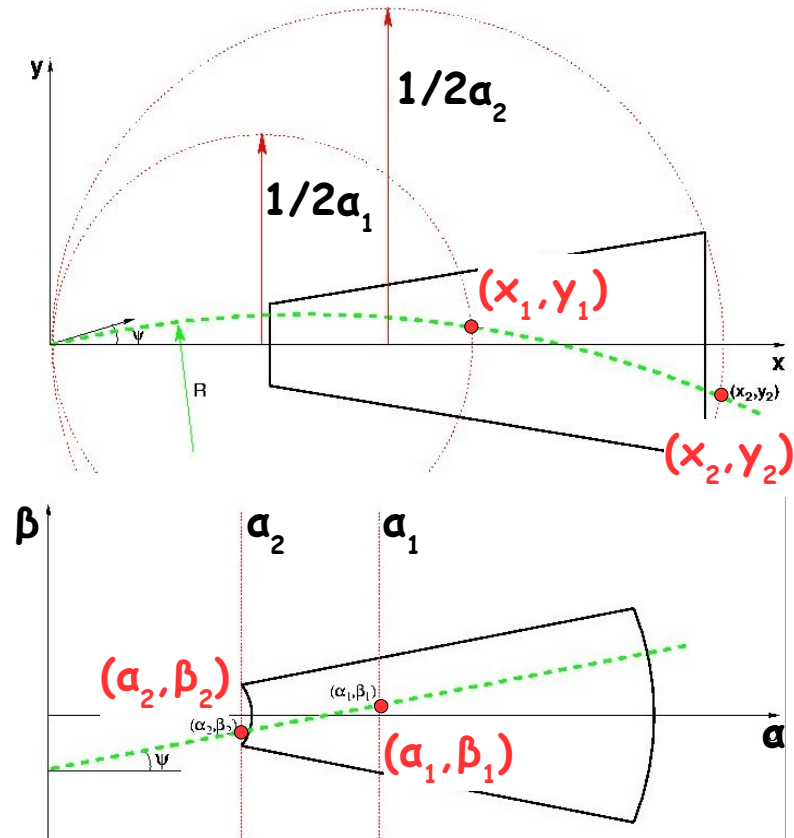




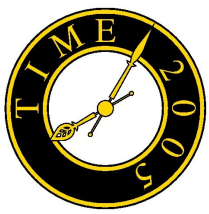
# ALICE TPC

## Fast Hough Transform for HLT tracking:

- consider only tracks from primary vertex, neglect energy loss and multiple scattering, divide data into slices in pseudo-rapidity -> 2D tracks, described by circles in  $x, y$
- conformal mapping of image space:
  - $x, y \rightarrow \alpha = x/(x^2+y^2), \beta = y/(x^2+y^2)$
  - > tracks are straight lines in  $\alpha, \beta$
- parameter space: fix two values  $\alpha_1, \alpha_2$ 
  - > tracks defined by intersections  $\beta_1, \beta_2$
- performance for  $80 (\beta_1) \times 120 (\beta_2)$  bins:
  - efficiency > 95%
  - pT resolution ~ few %
  - fake track rate < 2% up to  $dN/d\eta < 4000$







# Track Fitting

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## Track fit should provide:

- optimal track parameters and covariance matrix at both ends of track
  - > for physics analysis (vertex) and extrapolation into other detectors
- overall  $\chi^2$  of the track to test quality of pattern recognition
- the  $\chi^2$  for each hit on the track to permit outlier selection and removal

## Methods:

- simple least squares fit with ideal track parametrisation (e.g. helix)
  - > fast, but not good enough in presence of multiple scattering
- global track fit (e.g. describe trajectory by  $n \times n$  covariance matrix)
  - > computing time grows with  $n^2 - n^3$ , too slow if number of hits  $n$  large
- Kalman Filter: add measurements one by one, improving track parameters and covariance matrix at each step
  - > computing time  $\propto n$
  - > incorporate multiple scattering as process noise
  - > second path needed to obtain track parameters at both ends of track



# "Broken Line" Fit

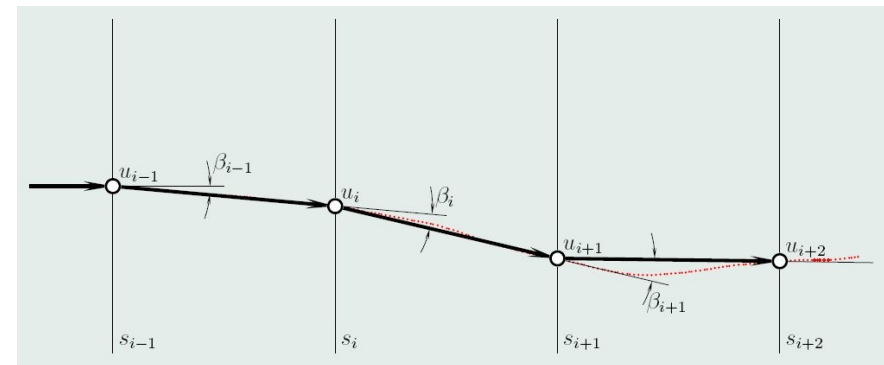
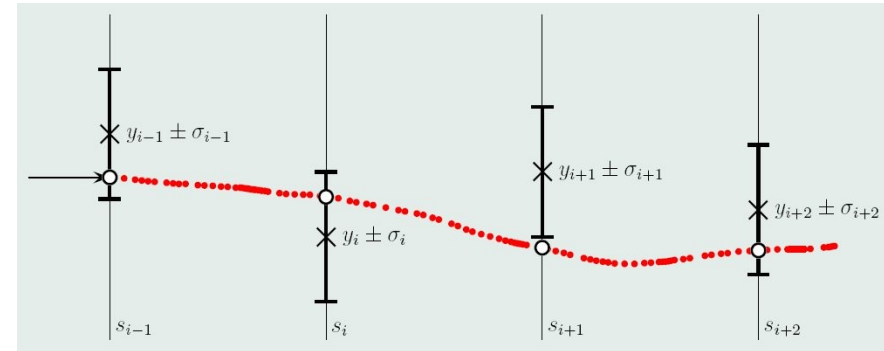
## New proposal for a fast global fit (Volker Blobel):

- perform LS fit to an ideal track model to get rough estimate of momentum
- model track by broken lines between detection planes, determine intersection points  $u_i$  and "kick angles"  $\beta_i$  in a LS fit
- assume  $B = 0$  for now  $\rightarrow$  kick angles  $\beta_i$ :
  - have expectation value zero
  - have variance given by m.s. theory
  - are (to good approximation) given by

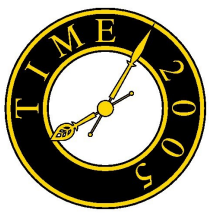
$$\beta_i \approx \frac{u_{i-1}}{s_i - s_{i-1}} + \frac{u_i (s_{i+1} - s_{i-1})}{(s_{i+1} - s_i)(s_i - s_{i-1})} + \frac{u_{i+1}}{s_{i+1} - s_i}$$

- perform LS fit by minimising function:

$$S(\mathbf{u}) = \sum_{i=1}^n \frac{(y_i - u_i)^2}{\sigma_i^2} + \sum_{i=2}^{n-1} \frac{\beta_i^2}{\sigma_{\beta,i}^2}$$



- $s_i$  = positions of detection planes
- $u_i$  = particle intersection points
- $\beta_i$  = kick angles
- $y_i$  = measured coordinates
- $\sigma_i$  = measurement errors

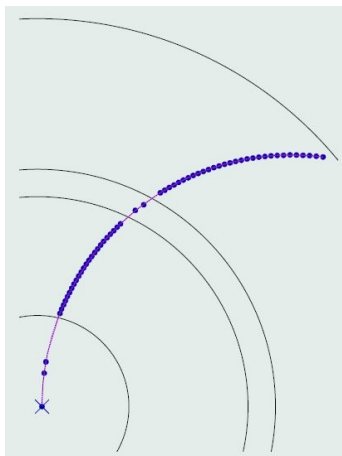


# "Broken Line" Fit

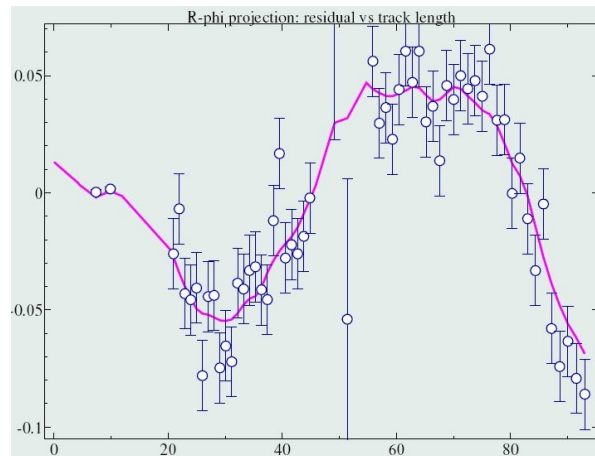
- find the  $u_i$  that minimise  $S(u)$ :  
solve the normal equations  $C \cdot u = r$
- $C$  is sparse  $n \times n$  matrix: non-zero elements only in a narrow band around the diagonal
- fast algorithms exist for inverting the matrix: computing time  $\propto n$
- with magnetic field: have to take track curvature into account
  - > expectation value of "kick angles" no longer zero
  - > complicates equations somewhat, but not too much

$$C = \begin{pmatrix} C_{11} & C_{12} & C_{13} & & & & & & & & \\ C_{21} & C_{22} & C_{23} & C_{24} & & & & & & & \\ C_{31} & C_{32} & C_{33} & C_{34} & C_{35} & & & & & & \\ & C_{42} & C_{43} & C_{44} & C_{45} & & & & & & \\ & & C_{53} & C_{54} & C_{55} & & & & & & \\ & & & & & & & & & & \dots \end{pmatrix}$$

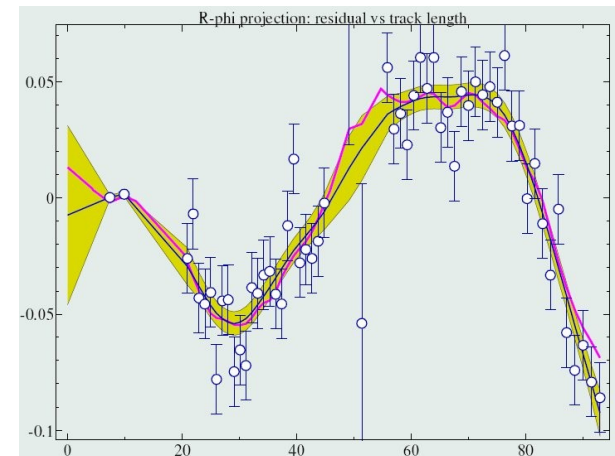
in toy Monte Carlo  
~ 6 times faster than  
Kalman Filter



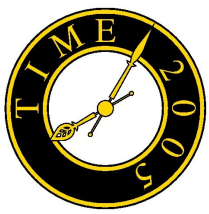
circle  
fit



broken  
lines  
fit







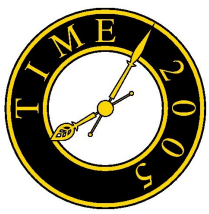
# TIME for Conclusions

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## Olaf's main lessons:

- detectors are complex systems, they will never be perfect
  - > build sufficient redundancy into the system
  - > algorithms must be able to cope with missing information
- a good understanding (and modelling) of detector performance is crucial for tuning algorithms and getting the most out of the available information
  - > material distribution, cluster shapes, overlapping clusters ...
- many different tracking algorithms are available or have been proposed
  - encourage parallel developments within the collaboration
  - for specific physics / detector problems
  - competition leads to better algorithms
- tracking in high multiplicity environments IS a real challenge, but ...

“... there is confidence that good ... strategies will be available at the time when they will be needed.” (V.Blobel, proc. TIME'05)



# Hungry for more ?

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Obviously, this could only be a very brief and superficial overview:

- strongly biased by my own interests  
(and the selection of the papers I had to review)
- said nothing at all about several topics discussed at the workshop  
(e.g. vertexing, triggering, new detector technologies)

If you want to learn more, have a look at:

- slides from all presentations, on our web page:  
<http://ckm.physik.unizh.ch/time05>
- proceedings, submitted to Nucl Instr and Meth, should soon appear on:  
<http://www.sciencedirect.com/science/journal/01689002>