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# Offline Software and Tracking at the LHC

Developments in offline software and tracking, experience from Run-1, recent shutdown upgrade activities, as well as challenges ahead



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# Introduction: LHC

## • LHC is a high energy and high luminosity proton-proton collider

- ➡ design centre-of-mass energy is *14 TeV* and design luminosity is  $\mathscr{L} = 10^{34} \text{ cm}^{-2} \text{s}^{-1}$
- **■** first collider to reach energy regime of high energy cosmic rays (HECR)
- $\rightarrow$  expect  $\sim$ 23 *p-p* collisions at a bunch crossing frequency of 40 *MHz* (!)

## • LHC is a unique machine

- ➡ frst collider to explore the physics at the *TeV* scale
- **excellent sensitivity to rare (new physics) processes**

## • expected production cross-sections

- ➡ large inclusive *b*, *W/Z* and *top* production rates
	- LHC is a combined *b*-, *W/Z* and *top*-factory
- ➡ cross-section for jet and *W/Z* production orders of
	- magnitude larger than e.g. expected for Higgs
- **■** total cross-section dominated by soft interactions









## Introduction: LHC Experiments







## ATLAS and Track Reconstruction

### • general purpose detector

- ➡ optimised for rich *p-p* program at design luminosities
- ➡ as well good performance for heavy ions

### • excellent calorimetry

### •two major tracking systems

- **➡ Inner Detector**
- **Muon Spectrometer**



### **• tracking used all across object reconstruction**

Marrakech: Andi, Andreas, Daniel, me, Heather

- $\rightarrow$  leptons ( $e/\mu/\tau$ ) and photons
- ➡ primary vertexing and favour tagging
- **→ pileup removal for jet and missing ET reconstruction**

#### The early Times of LHC/ATLAS Software 0 1988 1989 1990 1991 1992 1993 1994

### • project started during LEP era in '90s

- ➡ LoI and TDRs done with infrastructure of the time
	- software in FORTRAN 77, CERNLIB incl. PAW, Geant3
	- general LINUX services at CERN started in 1997

## • huge challenges ahead

- $\rightarrow$  LHC is a high energy and high luminosity machine  $\qquad \qquad$   $^{1988}$   $^{1990}$   $^{1992}$   $^{1992}$ 
	- unprecedented trigger rates, event sizes, pileup
- $\rightarrow$  lots of questions to answer...
	- design the High Level Trigger systems ? (can it be done in software, even re-using offline code)
	- how to build up the software infrastructure? (move to C++/OO, learn from BaBar and CDF/D0 Run-2 preparation)
	- a computing infrastructure matching the needs? (building "the" LHC computing centre at CERN wasn't an option)
	- how to do high performance tracking at LHC pileup (and how to do this within the available computing resources)
- **→** not to forget, LHC startup was supposed to be 2005



(well, it came different after all)







## Outline of this Talk

- •building up the software of the experiments
- •ATLAS tracking software and its concepts
- early physics and experience from Run-1
- the Higgs discovery
	- → the role of the offline software
- preparing for Run-2
	- **first upgrades of the offline software**
- **future offline software challenges**
- •summary and outlook





# Building up the Software of the Experiments





## ROOT (Rene and Rdm OOTechnology\*)

### •project started 1995

- **→ by R.Brun and F.Rademacher (hence the name)** 
	- OO framework, having in mind the future LHC needs
	- as well, provided alternative to Objectivity/DB at the time
	- 1998 selected by Fermilab for Run-2 experiments
- **→** became "the standard" for HEP and LHC data analysis
	- used by Astrophysics, other sciences and felds
- → core team at CERN, effort at FNAL and large community input

### • framework for interactive analysis

- ➡ visualisation, math libraries, I/O
	- LHC data is based on ROOT persistency
- **→ distribution includes suite of other tools** 
	- xrootd, TMVA, RooFit/RooStats, ...
- ➡ total about 1.7 *million* lines of code
	- OpenHUB "estimated cost" is 27 M\$ [https://www.openhub.net/p/ROOT/estimated\\_cost](https://www.openhub.net/p/ROOT/estimated_cost)









### •Geant4 Collaboration started in 1999

- **successor of Geant series toolkits developed at CERN** 
	- early studies at KEK and CERN resulted in RD44
	- OO simulation of passage of particles through matter
- today effort at many large laboratories: CERN, FNAL, SLAC, KEK, ESA/ESTEC, ...
- **→ detector simulation for CMS, LHCb, ATLAS, (ALICE), ...**
- $\rightarrow$  used by nuclear, accelerator and medical physics,  $\rightarrow$ as well as space science
- ➡ about 2.1 *million* lines of code
	- OpenHUB "estimated cost" is 33 M\$

[https://www.openhub.net/p/geant4/estimated\\_cost](https://www.openhub.net/p/geant4/estimated_cost)

### • equally important: event generators

- ➡ Alpgen, Jimmy, Pythia6/8, Tauola(++), Sherpa, HepMC, Herwig(++), Photos, etc.
- ➡ C++ and Fortran, about 1.4 *million* lines of code





# Software of Experiments

## • all developed their own OO frameworks

- **→ ORCA (CMS), AliRoot based on ROOT (Alice), GAUDI (LHCb)**
- **ATLAS added its layer to GAUDI and called it ATHENA**

### •CMS started 2005 CMSSW to replace ORCA

- **→ based on experience from FERMILAB experiments** 
	- huge effort, took > 3 years
- ➡ today a full CMSSW release has 7.5 *million* lines of code
	- OpenHUB "estimated cost" is 125 M\$

[https://www.openhub.net/p/cms-sw-cmssw/estimated\\_cost](https://www.openhub.net/p/cms-sw-cmssw/estimated_cost)

• framework itself is only a fraction of this

### • software stacks of the experiments

- ➡ applications implemented in framework
	- detector simulation, trigger, reconstruction, ...
- **→ based on common software toolkits** 
	- development organised within LCG Application Area



ERN







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### Building the Offline Reconstruction Noise Method

### • migration to C++ based reconstruction

- **existing FORTRAN algorithmic code often state of the art** 
	- new ideas from LEP experience, later BaBar and CDF/D0
- lot of work (too much) went into OO design
	- "hip" at the time, today we have to back off again (see later)

### • new ideas to meet the LHC challenges

- **→ driver for innovation, lots of examples:** 
	- Deterministic Annealing Filters (Com.Phys.Com. 120 (1999) p.197)  $\sim$  tracking in ATLAS TRT at high pileup
	- STEP (J. Instr. 4 (2009) p.04001) ~ Runge-Kutta field integration for ATLAS+CMS muon tracking
	- JetFitter (J.Phys.Conf.Ser. 119 (2008) 032032)  $\sim$  novel secondary vertexing in jets for b-tagging
	- FastJet (hep-ph/0512210)  $\sim$  fast jet finding
	- Particle Flow (hep-ex/0810.3686) ~ reconstruction in CMS
- **→ later significant influx from CDF/D0, example:**











# ATLAS Tracking Software and its Concepts





## ATLAS Inner Detector

### • optimised for 24 pileup events





 $6.2m$ 

### •barrel track passes:

- 3 Pixel layers 250 *mm* thick
	- **→ 4x2 Si strips on stereo** modules12 *cm* x 80 *mm*, 285 *mm* thick
	- ➡ ~36 TRT 4 *mm* straws





# Electron Identifcation in the ATLAS TRT

 $\rightarrow$  e/π separation via transition radiation: polymer (PP) fibers/foils interleaved with drift tubes





## ATLAS Muon Spectrometer







### • a huge system

- ➡ 4 different technologies (MDT,CSC,RPC,TGC)
- ➡ large area (10.000 *m2*)
- $\rightarrow$  many channels (1 M)

### • toroid field configuration

■ large magnetic field variations in toroid

Three of four drift. tube lavers

➡ feld 4 *Tesla* near coils

### • optical alignment system





MDT station

# Tracking Software Concepts

# • developing the tracking for LHC detectors<br>
• how to do high performance tracking at LHC pileup? ATLAS Atlantis cosmics

- how to do high performance tracking at LHC pileup?  $\mathbf{H}$ 2 X (m)
	- and how to do this within the available resources?
	- keeping in mind trigger and offline use-cases

### •ATLAS has 2 tracking systems, 7 different detector technologies

- $\rightarrow$  reflected in high level software design
	- detector independent "Common Tracking" layer
	- · detector specific layers building on it
- **→ base classes, interfaces, mathematical tools all** in common tracking layer
	- e.g. event data model, extrapolation, ftters...

# •informal collaboration by CMS and ATLAS geometry event data

- R&D on fitting techniques (e.g. Deterministic Annealing Filters)
- **→ R&D on novel tracking geometries with embedded navigation (see later)**



R&D on modern Runge-Kutta field integration techniques ( Runge-Kutta-Nystrom with continuous energy loss and multiple scattering (STEP), J. Instr. 4 (2009) p.04001 ) **→ later series of LHC alignment workshops across all 4 experiments** 



Geom.

model



Trigger **Constanting Constanting Constanti** 

**Common Tracking**

base  $\parallel$  base  $\parallel$  Extrap.  $\parallel$  Fitter  $\parallel$  Vertexing  $\parallel$  Align.

EDM base

2 (m) Y 0 -2 (m) Y 0 -2

**Interfaces** 

## The Extrapolation Package

### •parameter transport engine used in tracking software

- ➡ central tool for pattern recognition, track ftting, etc.
- ➡ parameter transport from **surface to surface**, including covariance
- $\rightarrow$  encapsulates the track model, geometry and material corrections

### • main components

- ➡ modern Runge-Kutta propagators
- **navigation system (see below)**
- $\rightarrow$  B-field map with caching
- ➡ geometry model (see below)
- **→ material effects corrections**





## Full and Fast (Tracking) Geometries

### • complex G4 geometries not optimal for reconstruction

- ➡ simplifed **tracking geometries**
- **■** material surfaces, field volumes

## • reduced number of volumes

- blending details of material onto simple surfaces/volumes
- ➡ surfaces with 2D material density maps, templates per Si sensor...





\*1 ALICE uses full geometry (TGeo) \*2 plus a surface per Si sensor



## Embedded Geometry Navigation Scheme

### • embedded navigation scheme in tracking geometries

- **G4 navigation uses voxelisation as generic** navigation mechanism
- ➡ **embedded navigation** for simplifed models
	- used in pattern recognition, extrapolation, track ftting and fast simulation

### • example: ATLAS

- **→ developed geometry of connected volumes**
- ➡ boundary surfaces connect neighbouring volumes to predict next step





# Fast Track Simulation (Fatras)

### • convenient to construct fast track simulation

- ➡ re-use **extrapolation package** to propagate each particle:
	- transport engine with navigation
	- geometry model
	- B-feld map
- ➡ add **stack** to keep track of all particles produced and stack manager
- ➡ add set of **physics processes** describing interaction of particles with matter







0.75

 $0.8<sub>+</sub>$ 

 $0.85$ 

Pions

0.9

0.95

1

*ATLAS* Preliminary Simulation

### $|n|$ 0 0.5 1 1.5 2 2.5 -<sub>A</sub> · p<sub>r</sub>=5 GeV FATRAS p<sub>T</sub>=5 GeV Geant4  $-\Theta$  ·  $p_{\tau}$ =50 GeV FATRAS p<sub>T</sub>=50 GeV Geant4 pion efficiency





# Strategy of NewTracking in ATLAS



### Iterative Seeding totrategy ! first (global) **pattern recognition**,

finding hits associated to one track

## • the track finding algorithm

- ▶ tra find seedsfrom combination of 3 hits parasearch using hough transform
	- ➡ build **road** along the likely trajectory

### ➡ run **combinatorial Kalman Filter** for a seed

- ! more difficult with noise and hits from full **exploration** of all possible candidates secoupdate trajectory with hits at each layer
	- take material effects into account

### **I presibility of fakting protiction** •iterative seeding approach (Run-1)

- **■** seeds are worked on in an ordered list
- ▶ in mode Mith 3 Bixels, 2 Pixel+Strip, 3 Strips
	- classical picture does not work ➡ bookkeeping layer:
	- issical proture does not work<br>• hits from good candidates removed<br>vmore
	- anymore<br>build next seed ONLY from left over hits
	- sequential seed finding to avoid combinatorial explosion (see later w.r.t. parallel tracking)
- $\bullet\,$  unlike in the animation, tracks are found for one-after-the-other  $\bullet\,$ • unlike in the animation, tracks are found for one-after-the-other
	- hence, the ordering matters  $\cdots$  (especially sorting in  $p_T$  bins)





## Expected Performance

### • excellent preparation before startup

- $\rightarrow$  more than 10 years of simulation and test beam
- ➡ cosmics data taking in 2008 and 2009

### • detailed simulation studies

- **→ document expected performance in TDRs**
- $\rightarrow$  few of the known critical items:
	- material effects limit efficiency and resolution at low pt
	- good (local) alignment for *b*-tagging
	- momentum scale and alignment "weak modes"
- **focus for commissioning of tracking and vertexing**









#### Weighing Detectors during Construction **Weighing'detectors'during'construction** Weighdaassembled belangrijk ring Construction involving hard-to-validate thin-walled aluminum, copper/nickel, or titanium pipes and polyimide/aluminum tapes rather than the less risky but heavier stainless steel

### • huge *effort* in experiments

- ➡ put each individual detector part on balance and compare with model
- **CMS and ATLAS measured weight of their** tracker and its components
- ➡ correct the geometry implementation in simulation and reconstruction





measured before and example: ATLAS TRT after insertion of the SCT thewe are convergence then to the values of the values  $\frac{1}{2}$ 



The numbers are given in fractions of radiation lengths ( $X$ 0). Note that for  $A$   $\bar{X}$  for  $\bar{X}$ 







### MGA TRAM KIIN-Early Physics and the Experience from Run-1



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# First Data to Physics Results

### • a success story all along...

- ➡ detector, DAQ and trigger worked !
- **excellent quality of first data** 
	- fast convergence of calibration and alignment procedures
	- much smoother than many expected
- **■** striking level of modelling by simulation
	- thanks to careful preparation work, e.g. excellent model of tracker material
	- helped a lot the fast production of physics results

## • with luminosity increasing over the year 2010

- **→ quality of data approaching design** levels with series of reprocessings
- "re-discovered" the standard model

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F.Gianotti, ICHEP 2010

particles one-by-one





## • in the first year we achieve excellent Run 1 Tracking Performance Modu

### control on alignment

**→ local alignment, e.g. TRT wire plane offsets or Pixel bow** Y



### **→ global weak mode and time variations corrections**  $\begin{array}{r} \text{if } \mathbf{a} \text{ is a random variable, and } \mathbf{b} \text{ is a random variable, and } \mathbf{a} \text{ is a random variable.} \end{array}$







### Run 1 Tracking Performance <u>|L</u>

- •tracking efficiency difficult to measure for hadrons  $\overline{a}$ **10** measure to
	- **→** efficiency for entirely limited by material interactions

### • muons are almost ideal MIPs

- $\Rightarrow$  *Z, J/* $\psi$  and Y decays allow us to accurately measure the  $\frac{2}{3}$   $\frac{1}{3}$  ose the number of  $\frac{1}{3}$ tracking efficiency tracely incependent of  $\mu$  0.99
- $\rightarrow$  measured efficiency >99.5% for all Run-1 conditions  $\rightarrow$  0.97 0.1 < m| < 2.5  $\rightarrow$  All As  $\rightarrow$

### • excellent *b*-tagging performance

→ working point: 70% *b*-efficiency for light rejection >100 and  $\frac{1}{8}0.995$ bin and rapidly increases to nearly 100% for *n*BS













## the Role of the The Higgs Discovery: Offline Software



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# Situation in 2011

### •Higgs searches in 2011 data

- **→ both experiments saw "hints" for a light Higgs** 
	- about *~3*σ each, ignoring "look elsewhere effect"
	- indications as well in TEVATRON data
- **→ low mass region at LHC** 
	- many decay modes accessible (γγ, ZZ, WW, ττ, bb)
	- *yy* and *ZZ* yield excellent mass resolution (~1%)
- → detector performance crucial to all analyses (!)<br>● detector performance crucial to all analyses (!)

### • rapid increase in luminosity

- **→ pileup approaching design levels in 2011** 
	- mainly because of 50 *ns* operation
	- expectation was to exceed design level in 2012
- **→ concerns about pileup robustness and** performance of object reconstruction
	- experiments did intensive software development in preparation for 2012 data taking









# Updates to Tracking

## •CPU scales non-linear with pileup

- ➡ combinatorial explosion
	- CMS ~50% in tracking (e/γ dominated by special tracking too)
	- ATLAS  $\sim$  70% in tracking
- e.g. CMS gained factor 2-3 in CPU
	- optimisation of pattern for 30 pileup
	- as well technical optimisation (memory)
	- similar optimisation done in ATLAS

### •pileup robustness and performance

- ➡ improve track selections to control fakes
- **■** more robust tracking cuts for object reconstruction
	- e.g., tracking for conversions in ATLAS optimised to improve pileup stability (*H*→γγ)









## Updates to Vertexing and Jet/MET

### •primary vertexing

- **■** more robust selections and algorithm updates
- $\rightarrow$  still visible effects of vertex merging at high  $\mu$
- $\rightarrow$   $\Sigma$ p<sub>T</sub> based vertex tagging less and less optimal (see MC)

### • tracking as a tool for pileup control

- **■** combining calorimeter and tracking information
	- CMS jets,  $\sharp$ <sub>T</sub> and *t* based on Particle Flow
	- ATLAS used vertexing for pileup jet tagging (JVF and variants of it)
- $\rightarrow$  such techniques will be even more important in the future





# Tracking with Electron Brem. Recovery

### • strategy for brem. recovery

- **restrict recovery to regions pointing to** electromagnetic clusters (RoI)
- $\rightarrow$  pattern: allow for large energy loss in combinatorial Kalman flter !"" # \$%& () + "
	- adjust noise term for electrons
- $\rightarrow$  global- $\chi^2$  fitter allows for brem. point
- **adapt ambiguity processing (etc.) to ensure** e.g. b-tagging is not affected
- **→ use full fledged Gaussian-Sum Filter in electron** identifcation code

### • deployed before 2012

- **→** improvements especially at low  $p_T$  (< 15 GeV)  $\sim$  15 dev)
	- limiting factor for *H*→*ZZ\**→*4e*
- **→ significant efficiency gain for Higgs discovery** 
	- similar techniques used in CMS





## CERN Seminar July 4th, 2012: the Higgs



## •fantastic success (!!!)

- $\rightarrow$  software and computing had its share in it ...
- ➡ full chain worked excellent:
	- from detector  $+$  trigger to
	- prompt calibration,
	- Tier-0 reconstruction,
	- GRID distribution and
	- fast distributed analysis !



Results are preliminary:

- 2012 data recorded until 2 weeks ago
- xz larger event pile-up
- $\Box$  new, improved analyses deployed for the first time

H  $\rightarrow$  γγ and H $\rightarrow$  4l: high-sensitivity at low-m<sub>H</sub>; high mass-resolution; pile-up robust  $\Box$  analyses improved to increase sensitivity  $\rightarrow$  new results from 2011 data all the data recorded so far in 2012 have been analyzed  $\rightarrow$  results are presented here for the first time

### Other low-mass channels:  $H \rightarrow WW^{(*)} \rightarrow WW$ ,  $H \rightarrow \pi r$ , W/ZH $\rightarrow W/Z$  bb:

- $\Box$   $E_T^{miss}$  in final state  $\rightarrow$  less robust to pile-up
- worse mass resolution, no signal "peak" in some cases
- $\square$  complex mixture of backgroup
- $\rightarrow$  understanding of the detector advanced, but results not yet
- $\rightarrow$  2011 results used here for the









## Marrakech: Andi, Andreas, Daniel, me, Heather Preparing for Run-2: First Upgrades of the Offline Software



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## Run-2 has already started !

### • LHC beam is back!

➡ machine ready for 13 *TeV* operations

## • Run-2 until 2018

- **→ expect L**<sub>int</sub> ~ 120 *fb<sup>-1</sup>* with L<sub>peak</sub> ~ 1.7\*10<sup>34</sup> *cm<sup>-2</sup>s<sup>-1</sup>* 
	- need to be prepared for event pileup of 40
- $\rightarrow$  about factor  $>$  ~2 in interesting cross sections
	- expect twice trigger rates for same thresholds

## • substantial discovery potential for high-mass objects running at 13 *TeV*

- $\rightarrow$  already with 1 *fb<sup>-1</sup>* and m(system) > ~2 *TeV*
- $\rightarrow$  across all searches for  $\sim$  10 *fb<sup>-1</sup>*

### • continue to explore the rich LHC



### physics program

➡ Higgs, top, Standard Model, *b*-physics, ...

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# Pixel Upgrades for Run-2

### • aim is to mitigate effects of Run-2/3 pileup

- **→ ATLAS: IBL ready 2015, CMS: new 4 layer Pixels for 2017**
- **→ both experiments add low mass Pixel layer close to beam** 
	- improves impact parameter resolution
- **additional hit to reduce fakes and/or improve efficiency** 
	- and use 4th layer in seeding to reduce CPU

# • significant improvements on b-tagging

 $\rightarrow$  at 50 pileup both experiments recover b-tagging performance like without pileup, or even improve upon it



### **4 layer CMS Pixel Upgrade for 2017**









# Computing Constraints for Run-2

### • unlike Run-1, computing resources will be limited !

- **→ assumption is a constant computing budget**
- **■** interplay of technology advancement, market price and needed replacements



### • motivation for LS1 software upgrades

- ➡ ensure that Tier-0 can process 1 *kHz* trigger rate
- **→ optimise disk usage** (e.g. ATLAS new Analysis Model)
- •biggest problem will be disk !





## ATLAS New Analysis Model for Run-2

### • several issues with Run-1 model

- **analysis ntuples duplicate AOD (disk!)**
- **→ production of ntuples costly (time!)**
- ➡ analysers develop in ROOT (compatibility !)

### •"small" revolution for ATLAS

- **new format (xAOD) readable in ROOT** 
	- branch-wise reading at ROOT speed
	- object decoration with user data
- $\rightarrow$  centrally produce skims for analysers
	- train production model
	- smart slimming of xAOD objects
- → analysis tools transparently usable in ROOT and ATHENA
	- ROOT based and ATHENA based analysis software releases

### • changes for other experiments are less extreme

**→ similar pressure to reduce resource needs** 





## Tracking Developments towards Run-2

- •ATLAS and CMS focus on technology and strategy to improve CURRENT algorithms
	- ➡ improve software technology, including:
		- simplify EDM design to be less OO ("hip" 10 years ago)
		- ATLAS migrated to Eigen faster vector+matrix algebra (CMS was already using SMatrix)
		- vectorised trigonometric functions (CMS: VDT or ATLAS: intel math lib)
		- work on CPU hot spots (e.g. ATLAS replaced F90 by C++ for B-feld service)
	- **tune reconstruction strategy** (very similar in ATLAS and CMS):
		- optimise iterative track finding strategy for 40 pileup
		- ATLAS modified track seeding to explore 4th Pixel layer
		- CMS added cluster-shape flter against out-of-time pileup

### • hence, mix of SIMD and algorithm tuning

**→ CMS made their tracking as well thread-safe** 







# Tuning the Tracking Strategy

- optimal seeding strategy depends on level of pileup (ATLAS)
	- **fraction of seeds to give a good track candidate:**



- hence start with SSS at 40 pileup ! **Example 2008 parts (global) pattern recognition**,  $\frac{1}{2}$ 
	- **→** further increase good seed fraction using 4th hit further increase good seed fraction us



• takes benefit from new Insertable B-Layer (IBL)

### • final ATLAS Run-2 seeding strategy final ATLAS Run-

➡ signifcant speedup at 40 pileup (and 25 *ns*)







# CPU for Reconstruction

### •sum of tracking and general software improvements

- **→ improved software technology, including:** 
	- tracking related improvements
	- new 64 bit compilers, new tcmalloc
- → tune reconstruction strategy (very similar in ATLAS and CMS)
	- optimise track fnding strategy for 40 pileup
	- faster versions of things like FastJet, ...
	- addressing other CPU hot spots in reconstruction

## • huge gains achieved !

- $\rightarrow$  ATLAS reports overall factor  $>$  4 in CPU time
	- touched >1000 packages for factor 5 in tracking
- **→ CMS reports overall factor > 2 in CPU time** 
	- on top of their 2011/12 improvements
	- as well dominated by tracking improvements
- ➡ both experiments within 1 *kHz* Tier-0 budget
	- required to keep single lepton triggers







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# Tracking in dense Jets

## • problem of cluster merging

- merging when track separation reaches single Pixel size
- **→ during track reconstruction shared clusters are** penalised to reduce fakes and duplicate tracks

## • artifcial neural network (NN)

- $\rightarrow$  identify merged clusters and splitting them
- **→ during Run-I these were duplicated** 
	- though with different cluster positions
- $\rightarrow$  performance in these environments was known to be suboptimal

### • crucial in many areas:

- $\rightarrow$  b-tagging (especially at high momenta)
- $\rightarrow$  jet calibration and particle flow
- ➡ 3-prong τ identifcation



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### $\frac{1}{2}$  0.06  $\frac{1}{2}$  0 residual before and after splitting





# Run-2 Tracking in dense Jets

### • new strategy delays NN cluster splitting

- **■** pattern runs with merged clusters to find all candidates
- **■** split clusters in ambiguity solution using tracks
	- more information used to improve splitting performance
- ➡ improve logic to allow sharing (un-"splitable") clusters

### • significant improvement at high-pT

- **tau 3-prong inefficiency halved**
- ➡ b-tagging efficiency doubled





(CMS uses new splitting in clustering for Run-2)

Truth Jet p<sub>T</sub> [GeV]

1 B-Jet Efficiency B-Jet Efficiency *ATLAS* Preliminary TIDE  $0.9<sup>+</sup>$ Simulation,  $\sqrt{s}$ =13 TeV, Z'(3 TeV) ▲ Baseline 0.8<mark>는 IP3D</mark>  $0.7$ 0.6 0.5  $0.4$ 0.3  $0.25$ 0.1 0 0 200 400 600 800 1000 1200 1400









# Software for Detector Upgrades



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# LHC Upgrade Physics Goals

## • Higgs couplings and properties

- $\rightarrow$  few % on couplings possible with 3000(350) pb-1
- ➡ new channels opening up (e.g. *H*→μμ)
- ➡ measure *ttH* and 30% on Higgs self coupling

### • study vector boson scattering

- ➡ Higgs restores unitarity in VV scattering around 1 *TeV*
- extend reach for new physics searches
	- **e.g. for 3rd generation squarks and gauginos**

## • LHCb physics reach with 50 *fb-1*

- ➡ unique for new physics searches in *Bs* system
	- precision measurement of *B(s)*→μμ
	- few % in CP violating  $\phi_s$  from  $B_s \rightarrow \phi \phi$
	- CP violation in *B<sub>s</sub>→J/Ψ*φ
- → unprecedented charm yields
	- search for CP violation in charm decays

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# LHC Upgrade Program

### • Phase-1 upgrades (2018→)

- **LHCb and ALICE trigger-less readout**
- ➡ CMS and ATLAS ready for 350 *fb-1*
- Phase-2 upgrades (2023→)
	- HL-LHC upgrades for CMS and ATLAS for 3000 fb-<sup>1</sup>

### • software plays key role in this program

- $\rightarrow$  physics prospects, detector design, TDRs...
- **■** preparing offline and trigger for detector upgrades itself



 $\rightarrow$  Access very small x values

**THE CONDENSIGNATION Framework**

• option: ➡ Fiber Tracker to replace Inner (Si) and Outer Tracker

• Silicon Trackers  $\rightarrow$  Si strips (replace all)

> • VELO ➡ Si strips (replace all) **→ pixel or strips options**

Replace Internal Tracking System  $\rightarrow$  Improve IP resolution to measure meson and baryon down to  $P_t$  ~ 0

> Replace FE and RO of TOF/PHOS/TRD

Very forward EM + Hadron Calorimeter?

VHMPID: Cherenkov + EM  $\rightarrow$  PID up to 20 GeV/c

LHCb Detector Upgrades in LS2

ALICE Upgrades during LS2

•Outer Tracker ➡ straw tubes (replace readout)

• LLT Trigger Scheme  $\rightarrow$  up to 40 MHz into HLT with full reconstruction ➡ output 20KHz

> •Calorimeter ➡ PMTs (reduce PMT gain, eplace readout)

> > (during LS1)

New Muon Forward Tracker? Measure u IP

TPC: replace wire chambers with GEM chambers

**Replace Muons FE** 

• Muons ➡ MWPC (almost compatible)

 $\bullet$  RICH 1  $\rightarrow$  HPD

 $\circ$  Study Quark Gluon Plasma with Pb-Pb collisions : 6 x 10<sup>27</sup> Hz/cm<sup>2</sup>  $\rightarrow$  10 nb<sup>-1</sup> - Increase DAQ acquisition rate (current 5 kHz) to register all interactions ≥ 50 kHz

(replace HPDs and readout)

**Technical Design Report**

CERN

# Hardware based Tracking ?

### • current ATLAS trigger chain

- ➡ Level-1: hardware based (~50 *kHz*)
- Level-2: software based with regional access to full granularity data (~5 *kHz*) tracking
- ➡ Event Filter: software trigger (~500 *Hz*)

### • ATLAS installs FTK during Run-2

- **► hardware track reconstruction for Level-2 Trigger** 
	- associative memory (AM) chips to find patterns
	- FPGA based track parameter estimation
	- "Hit Worrier" (HW) to remove fakes
- slice installed for 2015, full coverage in 2016
	- will replace software based Level-2 tracking in ATLAS
- ➡ full event track reconstruction at latency of ~ 100 μ*s* 
	- fast track confrmation of Level-1 triggers
	- particle flow like tau tagging
	- fast b-jet tagging

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- pileup corrections for jets and missing  $E_T$
- **■** excellent performance for Level-2 purposes
	- track efficiency is 90-95% w.r.t. offline
	- track refit using full fitter recovers offline resolution







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enters

here

# Inner Tracker Upgrades for HL-LHC

## •CMS Inner Tracker

 $r$  [mm]

1000

 $800$ 

600

- **→ Strip tracker replacement** 
	- several layouts under consideration
	- short strips in *R*ϕ, macro-pixels in *<sup>z</sup>*
- $\rightarrow$  Level-1 track trigger with high  $p_T$  stubs
	- correlate 2 sensors, threshold~ *2 GeV*
	- pattern in FPGA or AM chips, FPGA fit
- $\rightarrow$  Pixels: extend  $\eta$  coverage to 4 (!)

### •ATLAS Inner Tracker



## Software and Manpower

### • software follows a natural life cycle

- **→ building up the software for an experiment**
- $\rightarrow$  start of operations and data taking

**140** 

120

100

80

60

20

**→ data analysis and detector upgrades** 

### • loss of software manpower in ATLAS/CMS

- **■** (mostly) students and postdocs moved on to do physics
	- same trend like in previous experiments
- **→ like CDF/D0 Run-2, LHC upgrade program is ambitious** 
	- need to find sufficient manpower to develop the software for the upgrade



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### Marrakech: Andi, Andreas, Daniel, me, Heather Future Offline Software Challenges



### the million dollar question: how to process HL-LHC events



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# Future Computing Needs

### • increase in raw data samples

- **→ driven by ALICE trigger-less readout** 
	- mostly for their online disk buffer
- **→ ATLAS and CMS increase of trigger rate** and event size (pileup)

## • total disk needs scales with raw

- → current models are above constant budget, hence need:
	- smaller data formats
	- new analysis models
	- use more tape (cheaper, continues to scale)
	- less replicas (use growing network bandwidth)

## •CPU needs less certain

- **→ best estimates are factors above budget** 
	- based on current applications and models





### Processor Technology looking for something do do: • Vector registers

### • Moore's law is still alive ve cores and contact the cores of the cores and cores are  $\sim$

- **→** number of transistors still doubles every 2 years  $\frac{1}{2}$ ii doubles every z years<br>and no longer increasing
	- no free lunch, clock speed no longer increasing <sub>'</sub>d ho longer increasing
- → lots of transistors looking for something to do: g ior some anny to
	- vector registers
	- out of order execution
	- hyper threading
	- multiple cores
- **■** increase theoretical performance of processors
	- increase theoretical performance of processors<br>• hard to achieve this performance with HEP applications

# • many-core processors, including GPGPUs

- **→ e.g. Intel Xeon Phi, Nvidia Tesla**
- → lots of cores with less memory<br>• same for ADM or ATOM based systems
	- same for ARM or ATOM based systems
- sarie for Anivi of Arolyi based systems<br>
 challenge will be to adapt HEP software
	- need to parallelise applications (multi-threading)<br>(GAUDI-HIVE and CMSSW multi-threading a step in this direction)
		- (GAUDI-HIVE and CMSSW multi-threading a step in this direction)
	- change memory model for objects, more vectorisation, ...







# Massively parallel Tracking ?



- ATLAS/CMS tracking strategy is for early rejection The CMS tracking relies on iterations (*steps*) of the tracking procedure; each step works on the remaining non-Table 1. Relevant parameters of the six iterative tracking steps in  $\mathcal{L}^{\mathcal{A}}$ the reconstruction in the reconstruction in this paper campaign description in this paper  $r_{\text{max}}$ size along the *z* axis and *d*<sup>0</sup> and *z*<sup>0</sup> are the transverse (i.e. in the *xy* plane) and longitudinal
	- **→ iterative tracking: avoid combinatorial overhead as much as possible!** impact to the second to the second to the final quark are final quark and to the final quality contribution to
		- early rejection requires strategic candidate processing and hit removal
	- **→** not a heavily parallel approach, it is a **SEQUENTIAL** approach!  $\overline{D}$  triplet pixel  $\overline{D}$  cm  $\overline{D$ FQUENTIAL approach !

#### Married, M • implications for making it massively parallel?  $\alpha$  pair  $\alpha$  parallel 2.0 cm  $\alpha$ **5 pair Tobels 1.6 6.0 cm 30.0 cm 30.0**

**→ Armdahl's law at work:** 

$$
Time_{\parallel} = Para / N + Seq
$$

- → iterative tracking: small parallel part Para, heavy on sequential Seq *atu, neavy* on sequential seq
	- hence, if we want to gain by a large N threads, we need to reduce Seq Through the control of the course of the control of the c

### • CMS study: run combinatorial filter in parallel for seeds<br>
a fed compressive on early rejection but still limit combinatorial overhead  $\blacksquare$  thitar in narallal for seads  $\blacksquare$  $\frac{1}{100}$

- → find compromise on early rejection, but still limit combinatorial overhead ac sun in the completed of overrieur
	- as a result, one spends somewhat more CPU, main gain is in memory



**■** promising if one uses additional processing power that otherwise would not be usable (many core processors) or if latency is the main issue (trigger)

# Tracking Algorithms for High Pileup

### • alternative tracking techniques for parallelisation?

**→ CMS investigated using Hough Transforms, limited by multiple scattering** 

### • tracking according to physics needs?

### **■** idea: run different tracking inside/outside Region-of-Interest

- best possible tracking for signal event or region
- faster, approximate tracking on pileup and underlying event (extreme: truth guided tracking on MC to avoid pattern overhead)
- experiments already started doing this in Run-1!
	- CMS runs tracking passes to recover efficiency for muons
	- ATLAS runs brem. recovery for tracks pointing to EM clusters

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- $\rightarrow$  and for Run-2
	- ATLAS regional tracking for photon conversions
	- both experiments have dedicated tracking in jets

### • need more R&D on future algorithms





**Region-of-**

**Interest**



# Detector Simulation

- •simulation limited by CPU
	- **avoid MC limiting physics precision**
	- ➡ need to increase GRID "MC luminosity"
- major software technology developments in simulation
	- ➡ Geant 4.10 introduces multi-threading support
	- **Geant V redesign to explore vectorisation**
- •ATLAS Integrated Simulation Framework (ISF)
	- ➡ mixes fast and full sim. in one event
		- spend time on important event aspects
	- **towards complete fast software chain** 
		- avoid digit. and reco. bottleneck
		- directly produce analysis formats (disk)





## ATLAS Level-2 GPU Tracking Prototype

### • as an example for a complete tracking chain on GPUs

- $\rightarrow$  from raw to tracks
- $\rightarrow$  currently many such R&D activities in CMS and ATLAS

### head. hit hit hit trailer head. hit hit trailer Pixel clusterization on GPU

- Two new algorithms for parallel execution: ections of hits
	- for algorithm **B** fast AND operation for symmetrical eader, trailer, actual

I

thread 0

### GPU-based track finding

 Algorithmic workflow inspired by SiTrack:







#### eveloped

#### **B.** The algorithm with cluster size control: *D. Emeliyanov J. Howard*

GPU-based data preparation

Structure-of-Arrays (So<mark>A) Arrays (Soc</mark>) (Soc) ( **Example 18 At**  $(A^L(i, j))$  **gives the number of walks of**  $A^{i}$  **and**  $B^{k}$  **@ CERN 4/14** Given cluster size limit  $L$  the algorithm calculates he *L*-th power of the hit adjacency matrix A length *L* from hit *i* to hit *j* **Basically, if**  $A^L(i, j) \neq 0$  the two hits belongs to he same cluster and the cluster diameter does  $\log$  exceed  $L$ 

Matrix multiplication can be done very efficiently on GPUs. In addition, this algorithm benefits rom all the matrix products being Boolean - bitwise AND is used instead of actual multiplication

eam decoding:

input 1D array

output SoA

word word

thread 2

coding are done in prking on global output

**■** significant speedup compared to running same chain on CPU

**→ CUDA vs openCL, development** and maintenance cost ?



## HEP Software Foundation

### recent workshop, see as well CHEP

### • initiative to raise profile of HEP software projects

- **→ building upon existing and** previous initiatives
	- hepfroge.org
	- Concurrency Forum
	- (less known) US HEP Forum for Computational Excellence
	- previous LCG Application Area
- **→ as well, existing HEP SW projects** 
	- Geant4, Root, ...
- **→ hopefully as well GRID software**



### • foundation as a bottom-up approach

- **invite participation in projects across experiments and collaboration beyond HEP**
- **→ hope to achieve synergies and bundle expertise on crucial technology developments**
- **■** may host tracking (reconstruction) algorithm forum to foster collaboration



# Common Algorithmic Software ?

### • examples for common algorithmic software

- **FastJet** de-facto standard for jet finding, distribution as part of LCG externals
- TMVA, RooFit/RooStat, HistFitter, BAT statistics and multivariate analysis
- **→ AIDA tracking primarily targeting ILC / FCC**
- **→ genfit** an implementation of standard track fitting techniques (Belle-II)
- ➡ CMS vertexing suite package of standard vertexing codes (CMS, Belle-II,...)
- ➡ VDT, SMatrix, Eigen vector algebra and math libs

### • a real integrated common tracking implementation?

- $\rightarrow$  AIDA is the one aiming at this ...
- **■** integration means picking a data model
	- determines Jacobians in math formulars
- **■** integration means framework interfaces
- **→ best physics performance?** 
	- pattern strategy depends on experiment
- manpower on AIDA vs (e.g.) CMS/ATLAS ?
- **→ discussion in ATLAS:**



• make tracking/vertexing suite public ? (for FCC)





## Building a "Forum" and a Community ?

### • some obvious observations:

- **■** we need to make workshops like Connecting the Dots more regular
	- yearly like BOOST workshops ? every 18 months like CHEP and ACAT ?
- **■** we need to think about dedicated schools to teach algorithms to students
	- we need to invest in future experts (and give them career perspectives)
- **→ do we need some more regular forum alongside the Concurrency Forum?** 
	- need will grow once we have more common developments to discuss
	- how often shall we do such a meeting initially ?

### • focus on exchange of ideas, techniques, best practices ...?

- **■** at Connecting the Dots meeting, not much enthusiasm across all experiments (but maybe FCC) to migrate to something like a common algorithm stack
- $\rightarrow$  common software projects may grow naturally out of needs we may identify

### • created as well a generic HSF mailing list:

<http://hepsoftwarefoundation.org/content/reconstruction-algorithms-forum>

■ to be used to bring together initiatives like Connecting the Dots for tracking and the communities working on boosted object reconstruction and alike





## Summary

## •building the LHC software and tracking

- took almost a decade to master the challenge
- $\rightarrow$  resulted in sophisticated software stags for the experiments
	- including highly optimised track reconstruction

### • excellent performance during Run-1

- $\rightarrow$  full benefit from careful preparation
- **→ good quality data and description in simulation** 
	- highly instrumental to fully explore physics reach, including the role of software in the Higgs discovery

### •shutdown preparations for Run-2

- **■** even higher pileup and limited computing resources
- **■** first round of software upgrades to mitigate effects

### • many more challenges ahead

- Phase-1 and Phase-2 detector upgrades
- ➡ IT technologies are changing dramatically