









#### GeantV – From CPU to accelerators



Philippe Canal (FNAL) for the GeantV development team

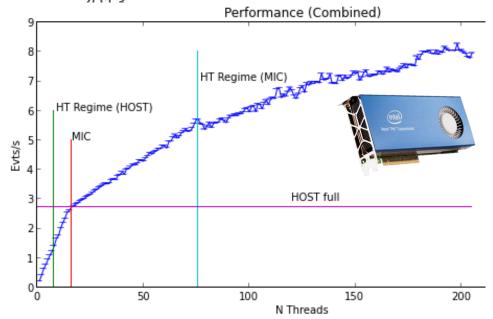
G.Amadio (UNESP), Ananya (CERN), J.Apostolakis (CERN), A.Arora (CERN), M.Bandieramonte (CERN), A.Bhattacharyya (BARC), C.Bianchini (UNESP), R.Brun (CERN), Ph.Canal (FNAL), F.Carminati (CERN), L.Duhem (intel), D.Elvira (FNAL), A.Gheata (CERN), M.Gheata (CERN), I.Goulas (CERN), F.Hariri (CERN), R.Iope (UNESP), S.Y.Jun (FNAL), H.Kumawat (BARC), G.Lima (FNAL), A.Mohanty (BARC), T.Nikitina (CERN), M.Novak (CERN), W.Pokorski (CERN), A.Ribon (CERN), R.Sehgal (BARC), O.Shadura (CERN), S.Vallecorsa (CERN), S.Wenzel (CERN), Y.Zhang (CERN)

#### Outline

- GeantVectorized an introduction
  - Challenges, ideas, goals
- Main components and performance
  - Design and infrastructure
  - Vectorization: overheads vs. gains
  - Geometry library
  - Physics processes
- Performance benchmarks
- Results, milestones, plans

## Geant4 Multi-threading

- Event level Parallelism
  - Each thread processes one full event exclusively
  - Part of Geant4 since release 10.0, Dec.

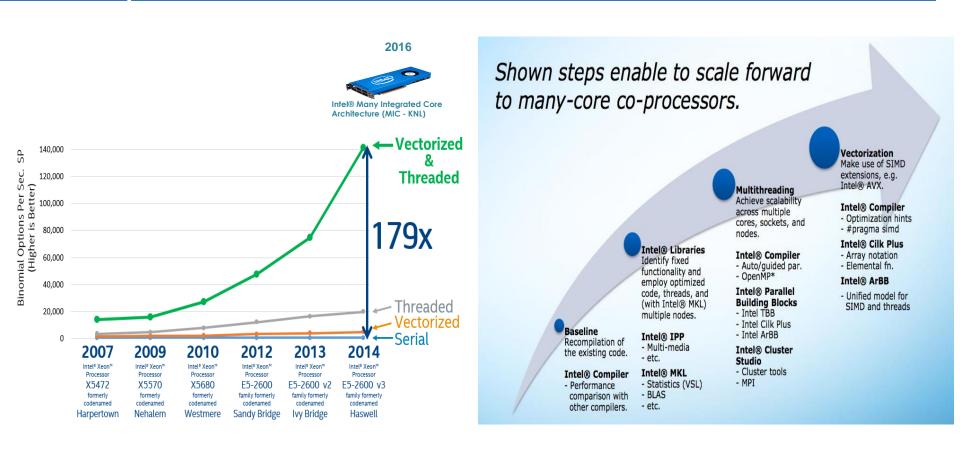


Preliminary, Courtesy of A.Dotti, SLAC

#### Demonstrates

- Linear scaling of throughput with number of threads
- Large savings in memory:9MB extra memory per thread
- No Performance/Throughput increase

# Hardware constraints and promised paths



Reality is that refactoring effort towards multi-level parallelism goes way beyond the usage of specific software tools and the effort and end result depend significantly on the workload and design.

#### What do we want to do?

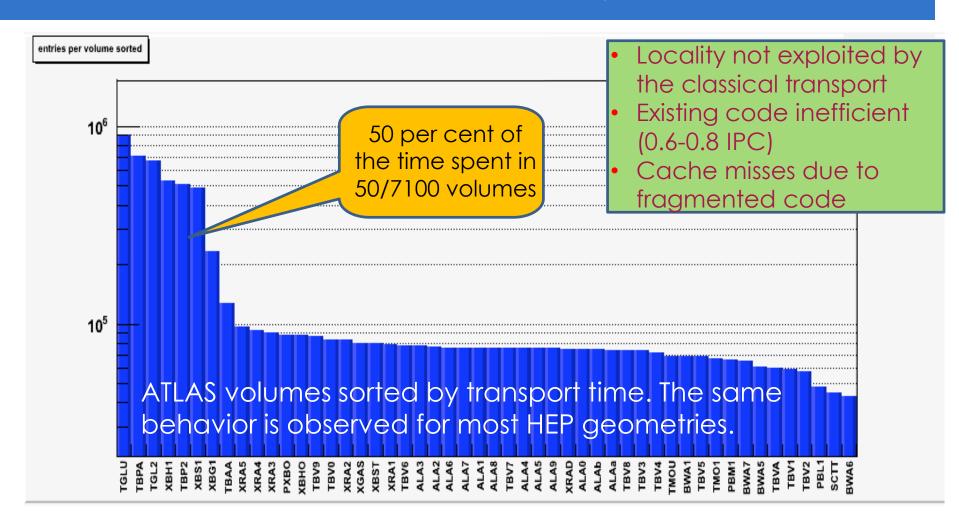
- Develop an all-particle transport simulation software with
  - Geant4 or new improved (where possible) physics models
  - A performance between 2 and 5 times greater than Geant4
  - Full simulation and various options for fast simulation
  - Portable on different architectures, including accelerators (GPUs and Xeon Phi's)
- Understand the limiting factors for a one-order-ofmagnitude (10x) improvement

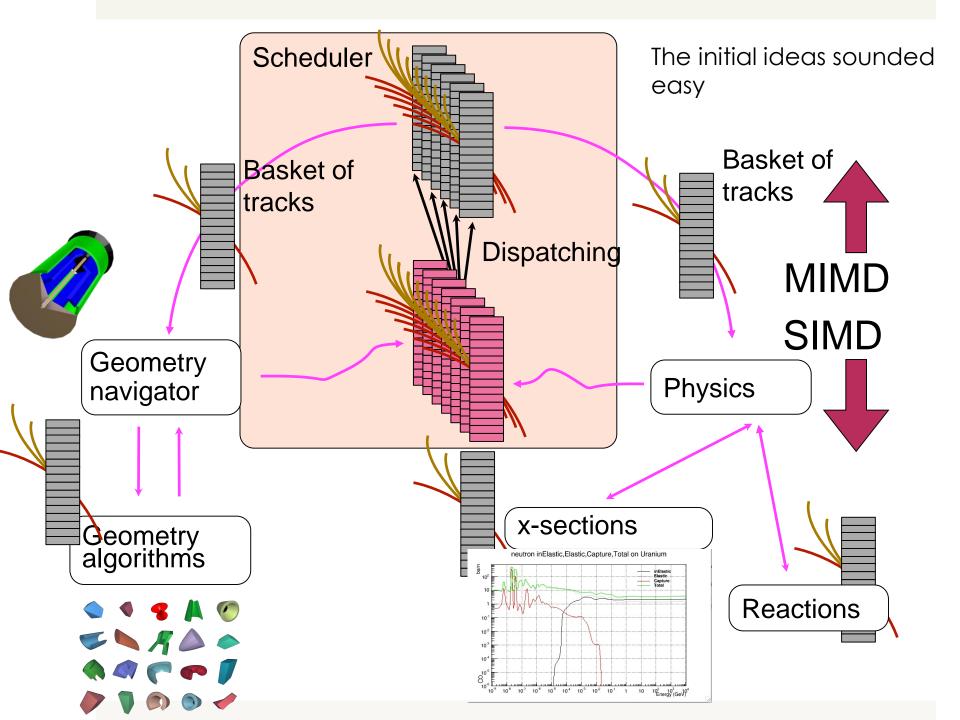
#### The ideas

- Transport particles in groups (vectors) rather than one by one
  - Group particles by geometry volume or same physics
  - No free lunch: data gathering overheads needs to stay less than vector gains
- Dispatch SoA to functions with vector signatures
  - Use backends to abstract interface: vector, scalar
  - Use backends to insulate technology/library: Vc, Cilk+, VecMic, ...
- Redesign the library and workflow to target fine grain parallelism
  - □ CPU, GPU, Phi, Atom, ...
  - Aim for a 3x-5x faster code, understand hard limits for more



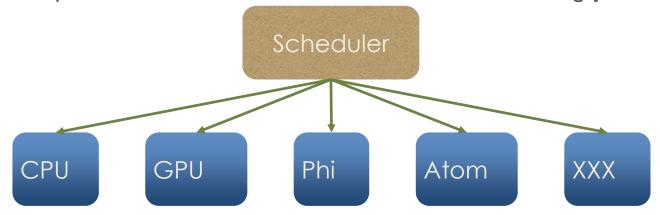
### HEP transport is mostly local!





### Challenges

- Overhead from reshuffling particle lists should not offset SIMD gains
- Exploit the hardware at its best, while maintaining portability



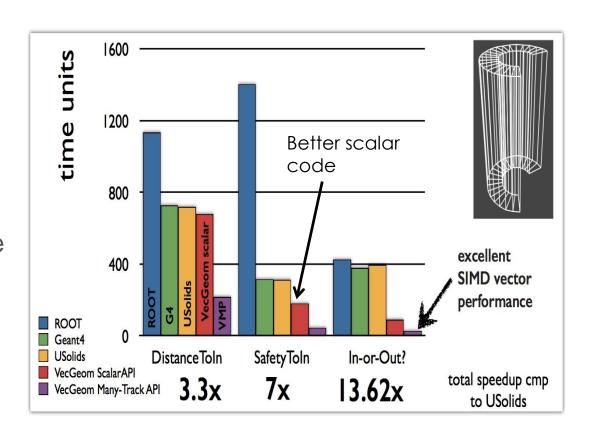
- Test from the onset on a "large" setup (LHC-like detector)
  - Toy models tell us very little complexity is the problem

#### Status on GPU

- Broker adapts baskets to the coprocessor
  - Selects tracks that are efficiently processed on coprocessor
  - Gather in chunk large enough (e.g. 4096 tracks on NVidia K20)
  - Transfer data to and from coprocessor
  - Execute kernels
- On NVidia GPU, we are effectively using implicit vectorization
  - Rather than one thread per basket, on GPUs we use 4096 threads each processing one of the tracks in the basket
- Cost of data transfer is mitigated by overlapping kernel execution and data transfer
  - We can send fractions of the full GPU's work asynchronously using streams

#### Geometry - VecGeom

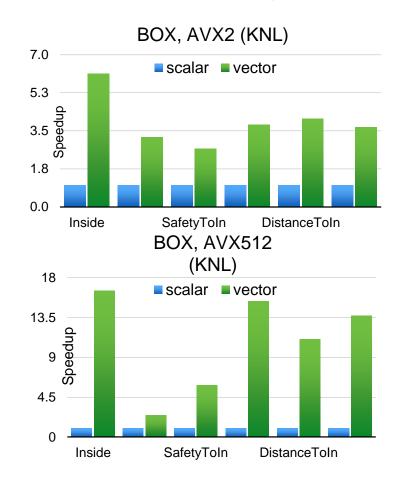
- Geometry takes 30-40%
   CPU time of typical
   Geant4 HEP Simulation
- A library of vectorised geometry algorithms to take maximum advantage of SIMD architectures
- Substantial performance gains also in scalar mode



#### Geometry performance on KNL

Intel® Xeon Phi<sup>™</sup> CPU 7210 @ 1.30GHz, 64 cores

- Running set of standard geometry benchmarks using UME::SIMD backend.
- Measuring vector versus scalar speed-up using AVX2 and AVX512, for CPU-intensive geometry navigation methods
- Observe super-linear speedup for some methods
- Investigating if it is compiler-related
  - Vector interface is better than scalar one (~x2 factor) w/o auto-vectorization
  - Found ~10% scalar performance improvement on KNL switching off auto-vectorization and setting different ISA options (AVX512 vs AVX2)



#### **Evolution**

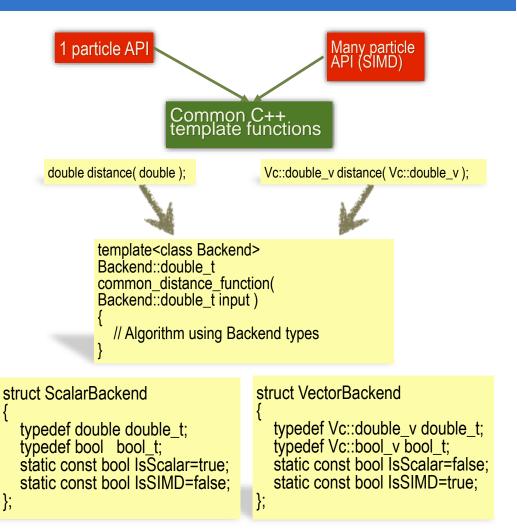
One becomes two, two becomes three, and out of the third comes the one as the fourth. Maria Prophetissa (3rd century AD)

- VecGeom code has been developed for GeantV vectorised transport
- USolids was developed to unify TGeo and Geant4 geometry packages
- Now VecGeom algorithms are retrofitted to USolids and are available both to Geant4 and to TGeo
- VecGeom has the potential to introduce a few percent gain for Geant4 (to be verified)
  - Algorithm improvement and (internal) vectorisation of some shapes
- VecGeom is the consolidation both on the algorithm level and on the developer level of G4-Geo, TGeo, USolid and Vectorization efforts.

#### Portability

- Long-term maintainability of the code
  - write one single version of each algorithm and to specialise it to the platform via template programming and low level optimised libraries (Vc in our case)
- A Xeon Phi specific backend is being developed in collaboration with CERN's openlab (UME::SIMD)
- Results are quite encouraging: maybe portable HPC is NOT an oxymoron after all...

"Backend" is a (trait) struct encapsulating standard types/properties for "scalar, vector, CUDA" programming; makes information injection into template function easy



### Avoiding code duplication

- Support of multiple platforms usually means multiple versions of source code
- What are the differences between the two versions of code shown on the right?
- Primarily: types and their operators, function attributes (\_\_device\_\_), also some higher level functions, e.g. conditional assignment
- Avoid code duplication by abstracting away differences into common types or overloaded functions defined in trait structures.

```
cuda
template <int N>
device
double Planes<N>::DistanceToOut(
   double const (&plane)[4][N],
  Vector3D<double> const &point,
  Vector3D<double> const &direction) {
  double bestDistance = kInfinity;
  for (int i = 0; i < N; ++i) {
    double distance:
    distance = -(plane[0][i]*point[0] + plane[1][i]*point[1] +
                 plane[2][i]*point[2] + plane[3][i]);
    distance /= (plane[0][i]*direction[0] + plane[1][i]*direction[1] +
                 plane[2][i]*direction[2]);
    bestDistance = (distance < bestDistance) ? distance : bestDistance;</pre>
  return bestDistance;
```

## Using traits to avoid code duplication

- Intensive kernels are developed in a generic way, using only trait-defined types and functions.
- Architecture-specific traits are created as needed, to associate generic types and functions with their archspecific types.
- Appropriate backends are requested by #define

#### backend/cuda/Backend.h

```
namespace vecgeom {
#ifdef VECGEOM NVCC
inline
#endif
namespace cuda {
struct kCuda {
  typedef int
                    int v;
  typedef Precision precision v;
  typedef bool
                    bool v:
  typedef Inside t inside v;
  const static bool early returns = false;
  static constexpr precision v kOne = 1.0;
  static constexpr precision v kZero = 0.0;
  const static bool v kTrue = true:
```

#### backend/vc/Backend.h

# A generic kernel

```
The Backend, as discussed
template <int N>
template <class Backend>
VECGEOM CUDA HEADER BOTH
typename Backend::Float t Planes<N>::DistanceToOutKernel(
    double const (&plane)[4][N]/
    Vector3D<typename Backend::Float t> const &point,
    Vector3D<typename Backend::Float t> const &direction) {
 typedef typename Backend::Float t Float t;
 typedef typename Backend::bool v Bool t;
  Float t bestDistance = kInfinity;
 Float t distance[N];
 Bool t valid[N];
                                              Arithmetics just works!
  for (int i = 0; i < N; ++i) {
    distance[i] = -(plane[0][i]*point[0] + plane[1][i]*point[1] +
                    plane[2][i]*point[2] + plane[3][i]);
   distance[i] /= (plane[0][i]*direction[0] + plane[1][i]*direction[1] +
                    plane[2][i]*direction[2]);
    valid[i] = distance[i] >= 0;
 for (int i = 0; i < N; ++i) {
    MaskedAssign(valid[i] && distance[i] < bestDistance, distance[i],
                &bestDistance);
 return bestDistance;
                              MaskedAssign() is an optimized if() replacement
```

# Geometry performance (Phi vs Xeon)

distFromInside mothervolume

pick next daughter volume

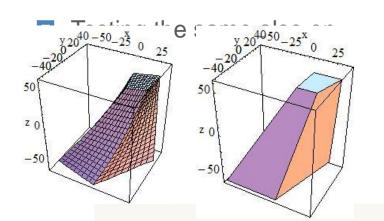
coordinates to daughter frame

distToOutside daughtervol

update step + boundarv

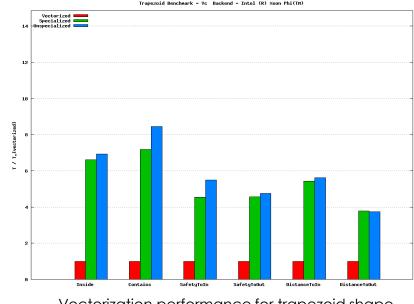
vector flow

- Geometry is 30-40% of the total CPU time in Geant4
- A library of vectorized geometry algorithms to take maximum advantage of SIMD architectures
- Substantial performance gains also in scalar mode



	16 particles	1024 particles	SIMD max
Intel Ivy-Bridge (AVX)	~2.8x	~4x	4x
Intel Haswell (AVX2)	~3x	~5x	4x
Intel Xeon Phi (AVX-512)	~4.1	~4.8	8x

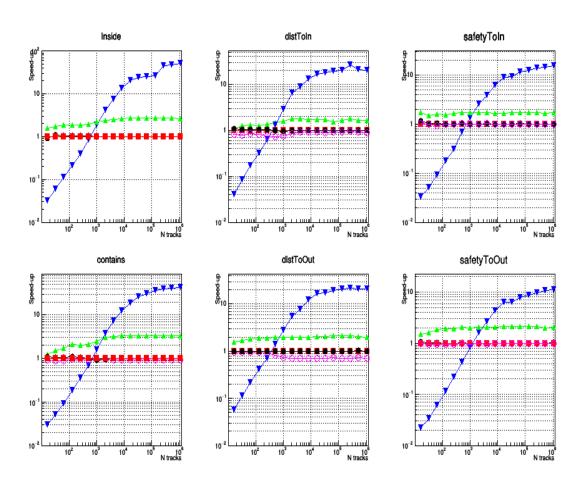
Overall performance for a simplified detector vs. scalar ROOT/5.34.17



Vectorization performance for trapezoid shape navigation (Xeon®Phi® COPRQ-7120 P)

# Geometry performance on K20

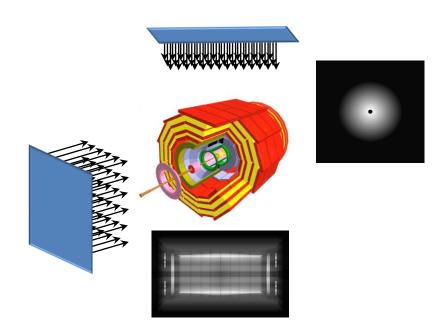
- Speedup for different navigation methods of the box shape, normalized to scalar CPU
  - Scalar (specialized/unspecialized)
  - Vector
  - GPU (Kepler K20)
  - ROOT
- Data transfer in/out is asynchronous
  - Measured only the kernel performance, but providing constant throughput can hide transfer latency
- The die can be saturated with both large track containers, running a single kernel, or with smaller containers dynamically scheduled.



Just a baseline proving we can

## The X-Ray benchmark

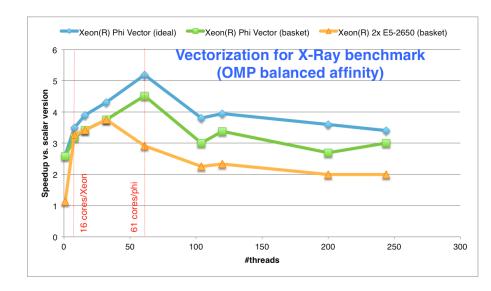
- The X-Ray benchmark tests geometry navigation in a real detector geometry
- X-Ray scans a module with virtual rays in a grid corresponding to pixels on the final image
  - Each ray is propagated from boundary to boundary
  - Pixel gray level determined by number of crossings
- A simple geometry example (concentric tubes) emulating a tracker detector used for Xeon©Phi benchmark
  - To probe the vectorized geometry elements + global navigation as task
  - OMP parallelism + "basket" model





# Vector performance

- Gaining up to 4.5 from vectorization in basketized mode
  - Approaching the ideal vectorization case (when no regrouping of vectors is needed)
- Vector starvation starts when filling more thread slots than the core count
  - Performance loss is not dramatic
  - Better vectorization compared to the Sandy-Bridge host (expected)



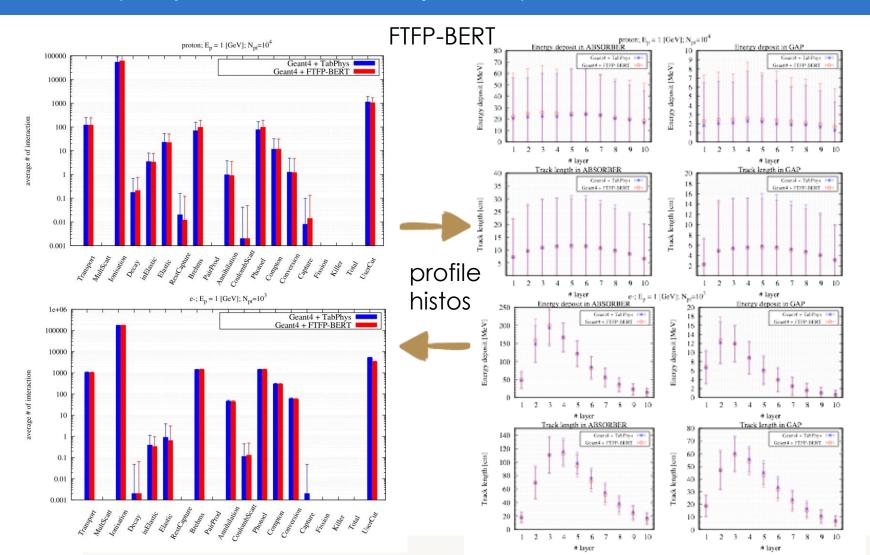
- Scalar case: Simple loop over pixels
- Ideal vectorization case: Fill vectors with N times the same Xray
- Realistic (basket) case: Group baskets per geometry volume

# What about physics?

- Needed a "reasonable" shower development
- Developed a library of sampled interactions and tabulated xsections for GeantV
  - Back ported to Geant4 for verification and comparison
- A quick tool for developing realistic showers
  - Potentially for developing into a fast simulation tool

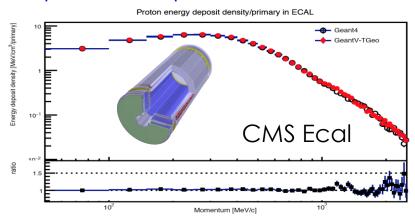
#### G4 example N03 vs tabulation

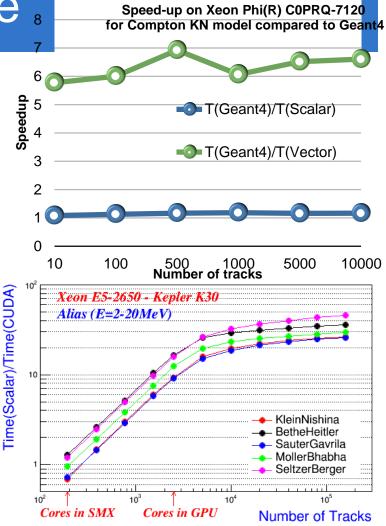
(simple calo with many slabs)



### Physics Performance \*

- Objective: a vector/accelerator friendly re-write of physics code
- Started with the electromagnetic processes
- The vectorised Compton scattering shows good performance gains
- Current prototype able to run an exercise at the scale of an LHC experiment (CMS)
  - Simplified (tabulated) physics but full geometry, RK propagator in field
  - Very preliminary results needing validation, but hinting to performance improvements of factors



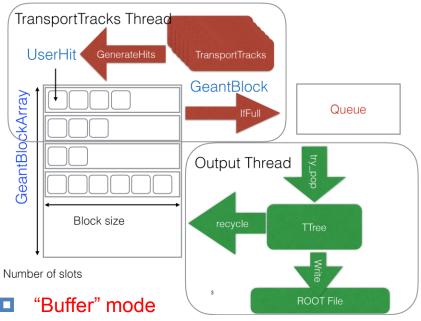


### GeantV Output

- Physics simulation produces 'hits' i.e. energy depositions in the sensitive parts of the detector
- Those hits are produced concurrently by all the simulation (TransportTracks) threads
- Thread-safe queues have been implemented to handle asynchronous generation of hits by several threads
- Dedicated Output thread transfers the data from the output queues to ROOT I/O

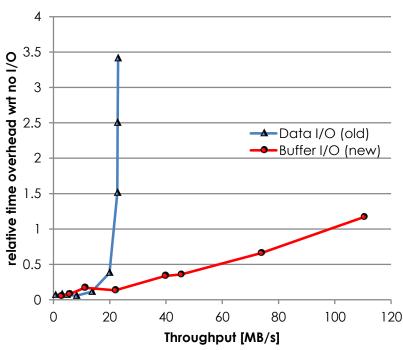
# Hits/digits I/O

- "Data" mode
  - Send concurrently data to one thread dealing with full I/O



Send concurrently local trees connected to memory files produced by workers to one thread dealing with merging/write to disk Integrating user code with a highly concurrent framework should not spoil performance

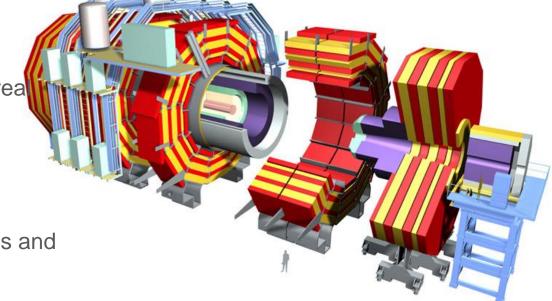
GeantV concurrent I/O 8 data producer threads + 1 I/O thread



# Yardstick: CMS With Tabulated Physics

#### Realistic Scale Simulation

- pp collisions @ 14TeV minimum bias events produced by Pythia 8
- 2015 CMS detector
- 4T uniform magnetic field
  - Decent approximation of the rea solenoidal field
- Low energy cut at 1MeV
- 'Tabulated' Physics
  - Library of sampled interactions and tabulated x-sections
- Same test (described above) run with both Geant4 and GeantV with various versions of the Geometry library.



# Putting It All Together - CMS Yardstick

Semantic changes

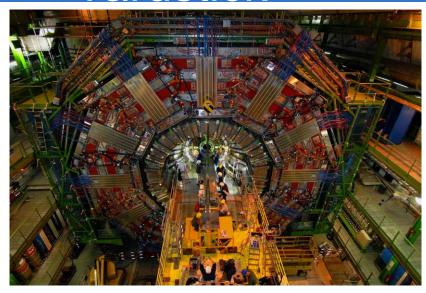
Scheduler	Geometry	Physics	Magnetic Field Stepper
Geant4 only	Legacy G4	Various Physics Lists	Various RK implementations
Geant4 or GeantV	VecGeom 2016 scalar	<ul><li>Tabulated Physics</li><li>Scalar Physics Code</li></ul>	<ul><li>Helix</li><li>Cash-Karp Runge-Kutta</li></ul>
GeantV only	<ul><li>VecGeom 2015</li><li>VecGeom 2016 vector</li><li>Legacy TGeo</li></ul>	Vector Physics Code	Vectorized RK Implementation

# Putting It All Together - CMS Yardstick

Semantic changes

Scheduler	Geometry	Physics	Magnetic Field Stepper
Geant4 only	Legacy G4	Various Physics Lists	Various RK implementations
Geant4 or GeantV	VecGeom 2016 scalar 3	<ul> <li>Tabulated         Physics     </li> <li>Scalar Physics         Code     </li> </ul>	<ul> <li>Helix (Fixed Field)</li> <li>Cash-Karp Runge-Kutta</li> </ul>
GeantV only	<ul> <li>VecGeom 2015 2</li> <li>VecGeom 2016 vector</li> <li>Legacy TGeo 1</li> </ul>	Vector Physics Code	Vectorized RK Implementation

# Putting It All Together - CMS Yardstick



- Some of the improvements can be back ported to G4
- Overhead of basket handling is under control
- Ready to take advantage of vectorization throughout.

Improvement Factors (total) with respect to G4

Legacy (TGeo) Geometry library:

■ 1.5 → Algorithmic improvements in infrastructure.

2015 VecGeom (estimate)

■ 2.4 → Algorithmic improvements in Geometry

Upcoming VecGeom (early result)

■ 3.3 → Further Geometric algorithmic improvements and some vectorization

#### Next steps

- Repeat the test with the introduction of
  - Vectorised EM physics
  - Vectorised transport in Mag Field
- Develop simple classes for materials and particles to be able to run on coprocessors to enable physics on the GPU and Xeon Phi full CMS yardstick
- implementing a "preliminary performance yard-stick" combining all prototype features
  - SIMD gains in the full CMS experiment setup
  - Coprocessor broker in action: part of the full transport kernel running on Xeon®Phi® and GPGPU
  - Scalability and NUMA awareness for rebasketizing procedure
  - ... achieving these just moves the target a bit further
- ... testing scaling up to large node count through MPI, e.g. on CORI
  - Input distribution and Output gathering.

#### Interaction with Frameworks

- Threading technology
  - Currently using std::thread to steer 'tasks' (but no thread local storage).
  - The number of threads used is configurable.
  - Testing OpenMP/MPI to steer Xeon Phi in offload mode and with separate processes.
  - Exploring if we can benefit from TBB and how to best coordinate with other uses
- Coprocessors
  - GPU (and Xeon Phi) can be used optionally via plugin
  - Enabling use of the coprocessor in offload mode will be done via a function call.
- Coprocessor sharing
  - Number of CUDA threads and blocks used by GeantV is customizable
  - Newer NVidia hardware support concurrent execution of independent kernels (in addition to the queue mechanism that was supported for a very long time).

#### Interaction with Frameworks

- Events/Data in and out from Frameworks
  - Still under design
  - Input
    - One or more initial particles coming from one or more events will be passed on
  - Output
    - Upon completion of the propagation of all the particles for an event, a call back will be made (CMSApplication::Digitize for example)
  - Should find a way to recast this flow into one of the TBB task mechanism
- Memory handling
  - Tied to the number of event in flight and the size of the output information
  - High watermark used to trigger a reduction in number of events in flight to limit memory usage to under the watermark

## Engagement

- VecGeom alpha release ready to be tested as Geant4 geometry update.
  - Magnetic field code update will also eventually be available to Geant4
- VecCore can be used to develop technology agnostic vector code
- GeantV ready to get out of the laboratory
  - Starting to think about/design interfaces for user actions, digitization, etc.
  - Welcoming early stakeholders to start reviewing the interfaces needed for a full application and develop more realistic tests and prototypes

## Restating our case

- We developed the three main components
  - A multithread scheduler to handle the particle baskets
  - A vectorised geometry library and navigator
  - A vectorised Compton scattering and a tabulated physics list
- Our results indicate that
  - Basket handling introduces a minimal overhead
  - SIMD gains half an order of magnitude in performance
- An optimistic prediction based on our results gives an improvement factor beyond the 3.3 currently achieved on CPU
- GPU and Xeon Phi improvement factors are expected to be higher

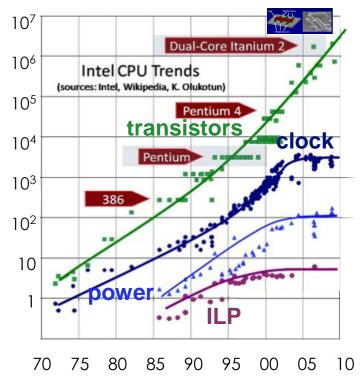
We are on track with achieving our objectives (see slide 22, 2 to 5 speedup)





### GeantV: (familiar) motivations

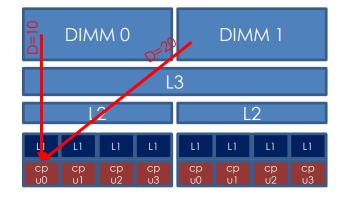
- Performance of our code scales with clock cycle (hence is stagnant!)
- Needs will increase more than tenfold and the budget will be constant at best
- HEP code needs to exploit new architectures and to team with other disciplines to share the optimization effort
  - Data & instruction locality and vectorisation
- Portability, better physics and optimization will be the targets
- Simulation can lead the way to show how to exploit today's CPU's resources more effectively in complex applications

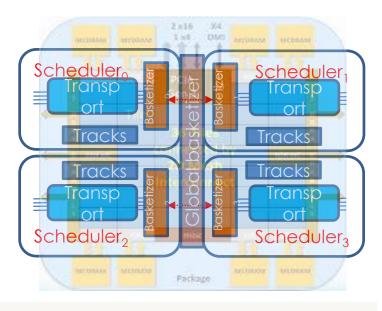


 Seeking ways to write code portable between CPU with vector units or not and accelerators (GPU, Xeon Phi)

#### **NUMA** awareness

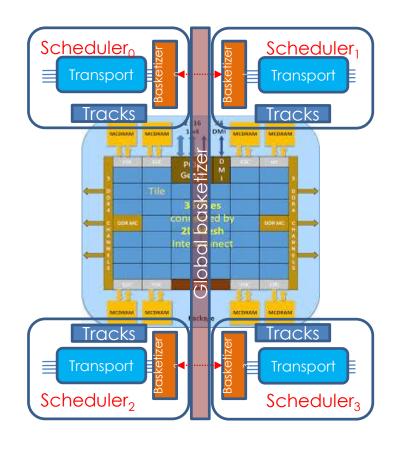
- Latency of memory access depends on "locality distance"
- Libraries used:
  - libnuma, numactl NUMA memory & thread affinity policies
    - Developed by SUSE Labs & SGI
    - Most linux flavors, LGPL license
  - Portable Hardware Locality (hwloc) NUMA topology detection, API & tools
    - Developed within Open MPI
    - NewBSD license
- Layer on top of libnuma & libhwloc to control affinity





# NUMA aware GeantV to be tested on KNL (SNC mode)

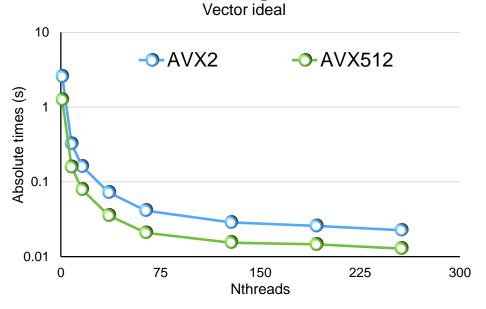
- Replicate schedulers on NUMA clusters
  - One basketizer per NUMA node
- 2 supported modes
  - MPI dispatch running one GeantV process per NUMA node
  - Single process spawning one scheduler per NUMA node
    - Loose communication between NUMA nodes at basketizing step
  - Currently under development

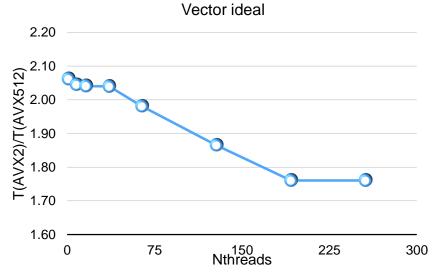


#### AVX-512 versus AVX2 on KNL

High vectorization intensity achieved for both ideal and basketized cases

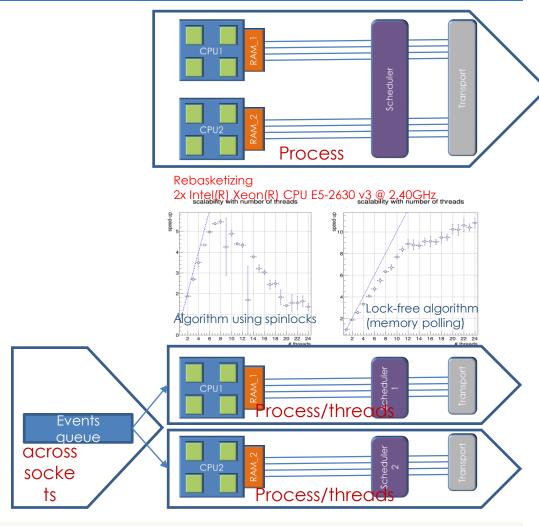
■ AVX-512 brings an extra factor of ~2 to our benchmark





## Scalability on many-core

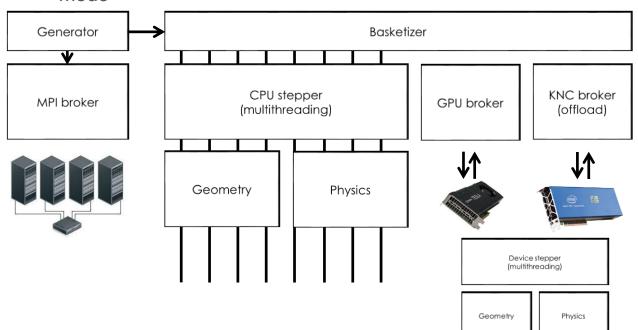
- Fine grain MT preventing to scale to high number of threads
  - Issue for many core architectures
- Split application in (NUMA-aware) clusters and use a common event queue for workload balancing
  - Lightweight/no interaction
  - Memory friendly
  - Possible to extend across sockets, replacing the concurrent queue with an event server



# Going CUDA – beyond writing custom kernels

GeantV scheduler can communicate with arbitrary device brokers

- Getting work and processing in native mode or processing steps of work and sending data back to the host
- Implemented so far: CUDA broker, KNC offload interface. KNL will work in native mode



Host code instrumented with \_\_host\_\_ \_device\_\_ macros

Instrumented methods compiled in ::cuda namespace

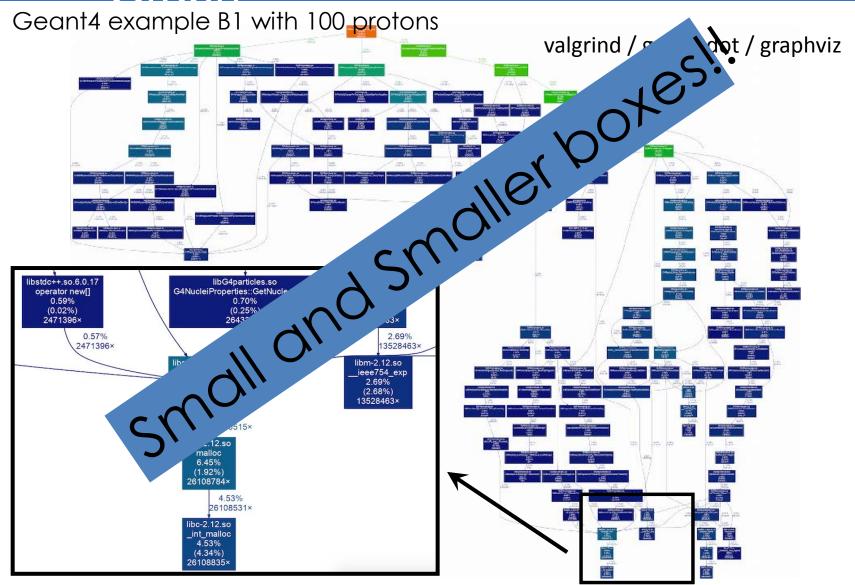
Library compiled for host and device (nvcc)

GPU broker dealing with initialization on device and data copying

### Why not Geant4+?

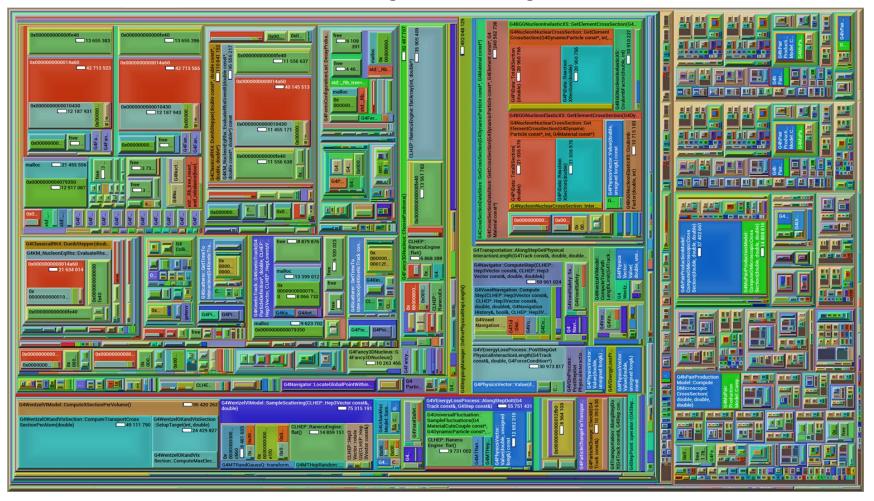
- Extensive prototyping and analysis has convinced us that "vectorisation" of Geant4 was not achievable without a major rewrite of the code
  - No hotspots (!)
  - Virtual table structure very deep and complex (1990's style)
  - Codebase very large and non-homogeneous
  - Auto-vectorization can only have small and very localized effect
- No criticism, but even the best things age (born 1994)

# Geant4 Profiling Example: Call Graph



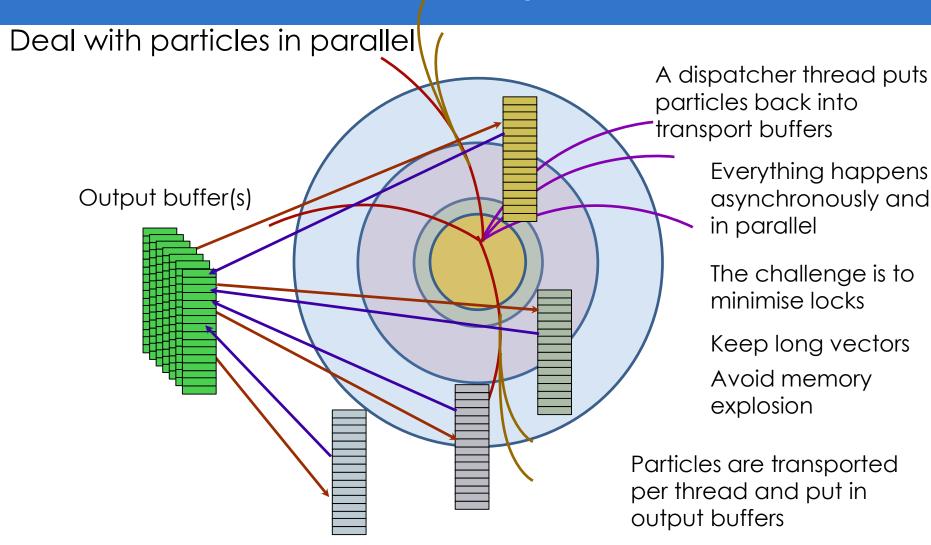
### Geant4 Profiling Example: Call Map

valgrind / kcachegrind



No easy to address hotspots

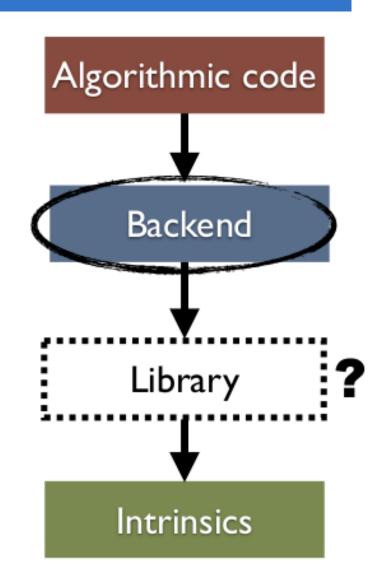
# "Basketised" transport



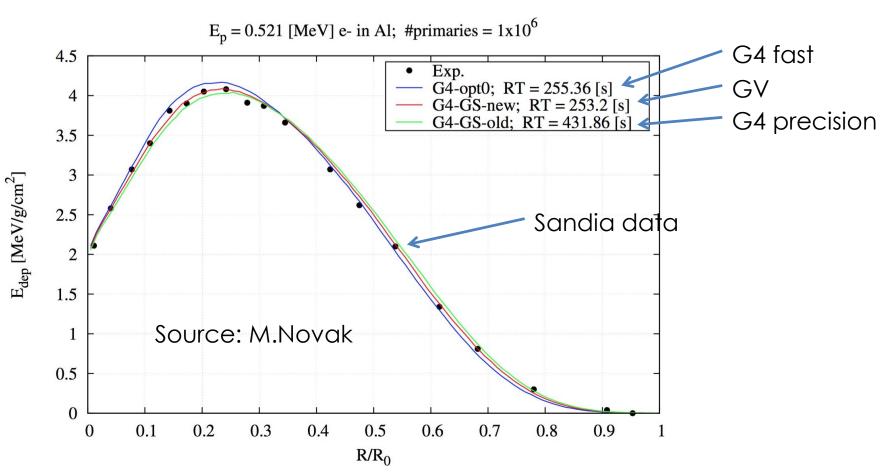
#### **Explicit vectorization**

- Explicit SIMD vectorization can be implemented directly using intrinsics, but a vectorization library already brings many utilities predefined, like common math operators and functions.
- VecGeom currently works with Vc library, by Mathias Kretz, but other libraries can be easily plugged in (Agner Fog's VCL, Intel's VML, Cilk Plus, ...).

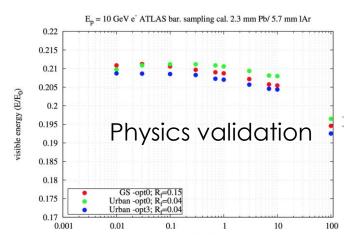
A new backend is maybe all that is needed.

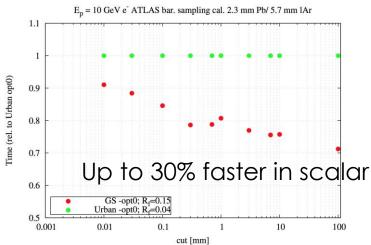


# Physics developments: Multiple Scattering



GeantV Multiple Scentification (30%-50%)





cut [mm]	Urban-opt0	GS-opt0	Urban-opt3
100	27241	15510	51862
10	35789	21898	64588
7	36505	22457	65431
3	38760	24270	68165
1	41341	26216	71677
0.7	42182	26867	72870
0.3	45024	29348	81452
0.1	50420	34467	87487
0.03	59302	43295	95970
0.01	78181	62549	114558

Table: number of charged steps

- The new algorithm is being now vectorised for GeantV
- It is in an experimental physics list for Geant4
  - Candidate to become the default

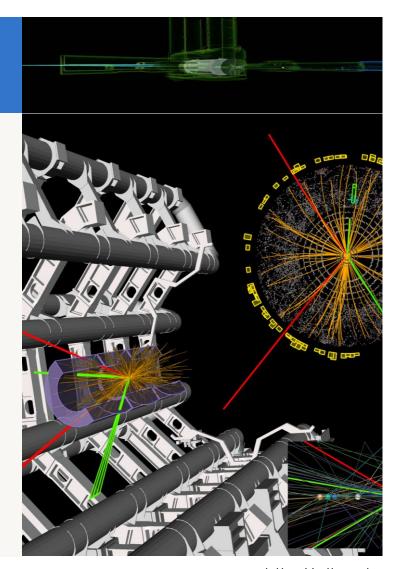
### The problem

Detailed simulation of subatomic particle transport and interactions in detector geometries

Using state of the art physics models, propagation in electromagnetic fields in geometries having complexities of millions of parts

Heavy computation requirements, massively CPU-bound, seeking organically HPC solutions...

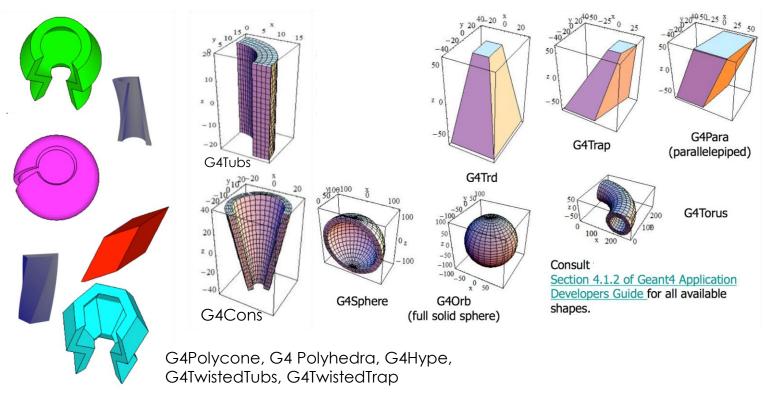
The LHC uses more than 50% of its distributed GRID power for detector simulations (~250.000 CPU years equivalent so far)



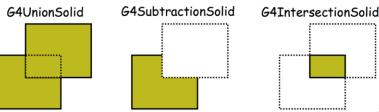
http://atlas.ch

#### **Geant4 Geometry**

#### A large collection of solids are defined in Geant4:

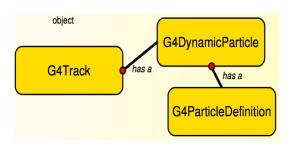


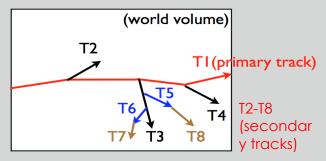
Also Boolean operations such as:



#### **Geant4 Transportation**

<u>A G4Track</u> also includes the info for transporting the particle through the detector → in G4 we typically use <u>Particle = Track</u>

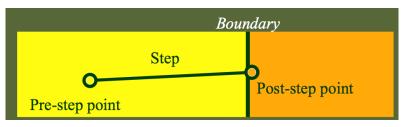




Tracking follows
"last in first out" rule:
T1->T4->T3->T6->T7 >T5->T8->T2

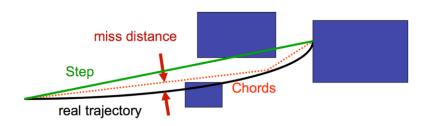
The G4Track information is updated after every G4Step

- > A G4Step is a step in the particle (track) propagation
- > The user defines a maximum step length but steps also end when a physics process is invoked and at volume boundaries



#### Geant4 Magnetic Field

Particle propagated in EM field by integration of equation of motion using the Runge-Kutta method (others also available)



- Curved path broken into linear <u>chord</u> segments to minimize the <u>sagitta</u> (maximum chord-trajectory distance)
- Chords used to interrogate navigator on whether the track has crossed a volume boundary
- miss distance parameter used to tune volume intersection accuracy

G4 supports user defined, uniform, and non-uniform (static or time dependent) magnetic fields

### Specialized Geometry Library.

- Backward compatibility with ROOT and Geant4
- Continue the already started AIDA USolids project
- Numerical simulation have special requirements on numerical stability (double vs float, no leaks, we transport things across boundaries often not the case in 3D graphics engines)
- HEP use specialized volumes not existing in external packages (*polycone*) and we can put a lot of domain specific knowledge to accelerate things
- Single solution for CPU and GPU
- Rely on special functions "safety" which might not exist in classical 3D rendering engines (which concentrate on hit detection)
- Need an exact volume representation (and not a triangle approximation).
- Different scale than most 3D graphics engines (that often have far fewer things to treat)