



traccc

on behalf of the traccc development team



What is traccc

- Subproject of Acts focusing on using accelerators to run track reconstruction

Why is traccc

- Modern GPUs are capable of processing large amounts of data very efficiently through massively parallel execution of SIMD kernels
- HL-LHC upgrade demands faster execution times, to which GPUs could provide a solution

Category	Algorithms	CPU	CUDA	SYCL	Futhark
Clusterization	CCL	✓	✓	✓	✓
	Measurement creation	✓	✓	✓	✓
Track finding	Spacepoint formation	✓	✓	✓	○
	Spacepoint binning	✓	✓	✓	○
	Seed finding	✓	✓	✓	○
	Track param estimation	✓	✓	✓	○
Track fitting	Combinatorial KF	○	○	○	○
	KF	●	●	○	○

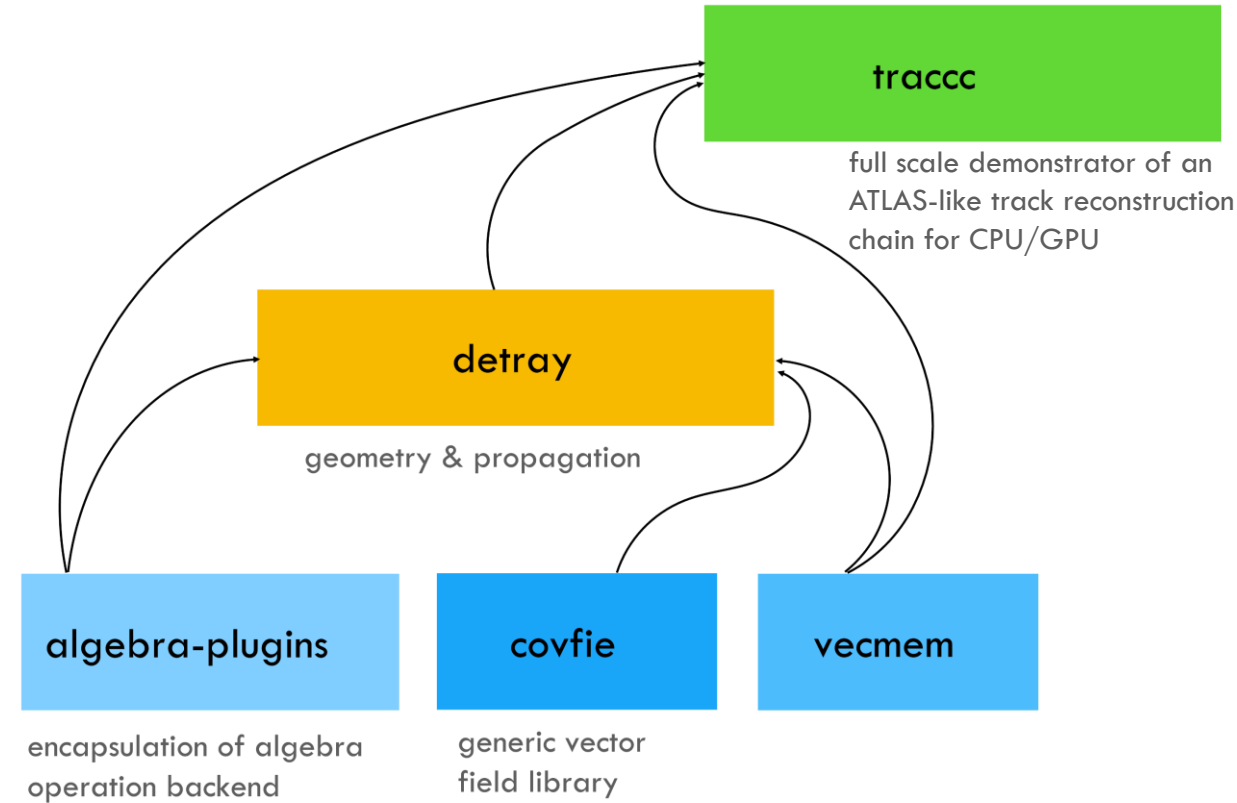
✓: exists, ●: work started, ○: work not started yet

The big picture

- Acts - Main project














traccc's dependencies:

- vecmem - Memory classes based on standard C++ for heterogeneous computing
- detray - Geometry model of detector
- algebra plugins - Useful mathematical functions



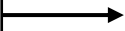
source: Andreas Salzburger

Code organisation

acts-project / tracc Public		
 .githubhooks	Add some documentation about git hooks	15 months ago
 .github	Switched the CI to the latest Acts Docker images.	8 days ago
 cmake	Add support for the Futhark programming language	18 days ago
 core	Made tracc::internal_spacepoint work with SYCL's NVIDIA backend.	3 days ago
 data @ 92fde47	Make clusterization result correct	4 months ago
 device	Add Futhark implementation of CCA	7 days ago
 doc/images	Migrate README flowchart to Mermaid	6 months ago
 examples	cuda seed_finding uses common triplet counting	last month
 extern	Taught the project how to download/build Thrust as part of its build.	8 days ago
 extras	Add a very short README to extras/	14 months ago
 io	Fix merge conflict	4 months ago
 plugins	Updated to Detray v0.6.0.	5 months ago
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Code organisation

CPU pipeline /
Common code



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CPU pipeline /
Common code
















Device pipeline



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	 plugins	Updated to Detray v0.6.0.	5 months ago
CI / Unit tests	 tests	Add Futhark implementation of CCA	7 days ago

Code model

- ✓ core
 - ✓ include/traccc
 - > clusterization
 - > definitions
 - > edm
 - > geometry
 - > seeding
 - > utils
 - > src

Code model

✓ core	✓ edm
✓ include/tracc	✓ details
> clusterization	🔗 container_base.hpp
> definitions	🔗 container_element.hpp
> edm	🔗 device_container.hpp
> geometry	🔗 host_container.hpp
> seeding	🔗 cell.hpp
> utils	🔗 cluster.hpp
> src	🔗 container.hpp
	🔗 internal_spacepoint.hpp
	🔗 measurement.hpp
	🔗 particle.hpp
	🔗 seed.hpp
	🔗 spacepoint.hpp
	🔗 track_parameters.hpp

```
🔗 device_container.hpp 4 × Settings
core > include > tracc > edm > details > 🔗 device_container.hpp > ...
22
23  /// Host container describing objects in a given event
24  template <typename header_t, typename item_t>
25  class device_container
26  |   : public container_base<header_t, item_t, vecmem::device_vector,
27  |                                     vecmem::jagged_device_vector> {
```

```
🔗 cell.hpp 1 × Settings
core > include > tracc > edm > 🔗 cell.hpp > ...
21
22  /// Definition for one detector cell
23  ///
24  /// It comes with two integer channel identifiers, an "activation value"
25  /// and a time stamp.
26  ///
27  struct cell {
28  |   channel_id channel0 = 0;
29  |   channel_id channel1 = 0;
30  |   scalar activation = 0.;
31  |   scalar time = 0.;
32  };
```

Code model

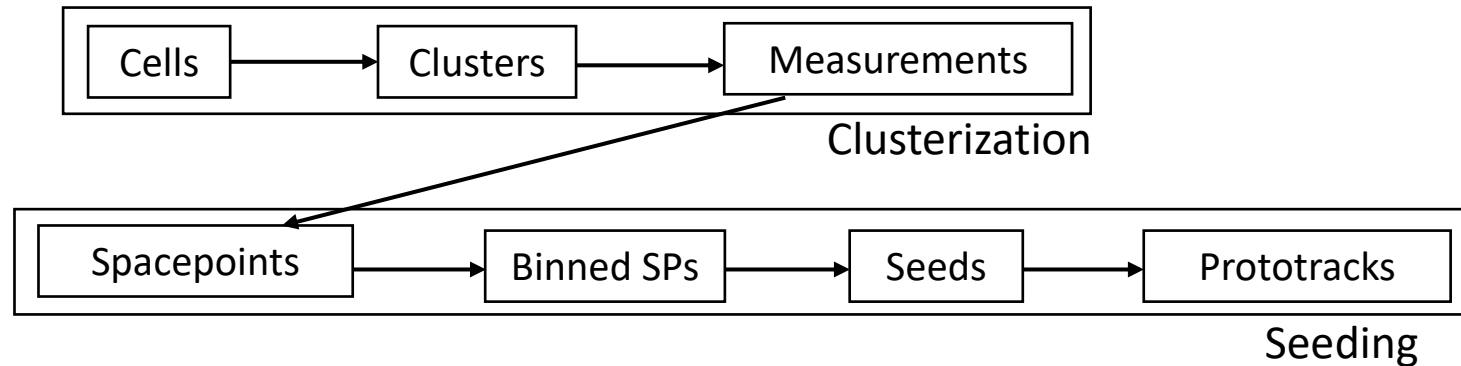
- core
 - include/tracc
 - clusterization
 - definitions
 - edm
 - geometry
 - seeding
 - utils
 - src
- seeding
 - detail
 - bin_finder.hpp
 - doublet.hpp
 - lin_circle.hpp
 - seeding_config.hpp
 - singlet.hpp
 - spacepoint_grid.hpp
 - triplet.hpp
 - doublet_finding_helper.hpp
 - doublet_finding.hpp
 - seed_filtering.hpp
 - seed_finding.hpp
 - seed_selecting_helper.hpp
 - seeding_algorithm.hpp
 - spacepoint_binning_helper.hpp
 - spacepoint_binning.hpp
 - track_params_estimation_helper.hpp
 - track_params_estimation.hpp
 - triplet_finding_helper.hpp
 - triplet_finding.hpp

```
doublet.hpp 1 x Settings
core > include > tracc > seeding > detail > doublet.hpp > ...
15 struct doublet_per_bin {
16     unsigned int n_doublets = 0;
17 };
18
19 /// Item: doublet of middle-bottom or middle-top
20 struct doublet {
21     // middle spacepoint location in internal spacepoint container
22     sp_location sp1;
23     // bottom (or top) spacepoint location in internal spacepoint container
24     sp_location sp2;
25 };
```

Code model

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 - track_params_estimation.hpp
 - triplet_finding_helper.hpp
 - triplet_finding.hpp

```
doublet_finding.hpp 1 x Settings
core > include > tracc > seeding > doublet_finding.hpp > {} tracc > doublet_finding
19  /// Doublet finding to search the combinations of two compatible spacepoints
20  struct doublet_finding
21  |   : public algorithm<
22  |   |   std::pair<host_doublet_collection, host_lin_circle_collection>(
23  |   |   |   const sp_grid&, const sp_location&, const bool&> {
```



Code model

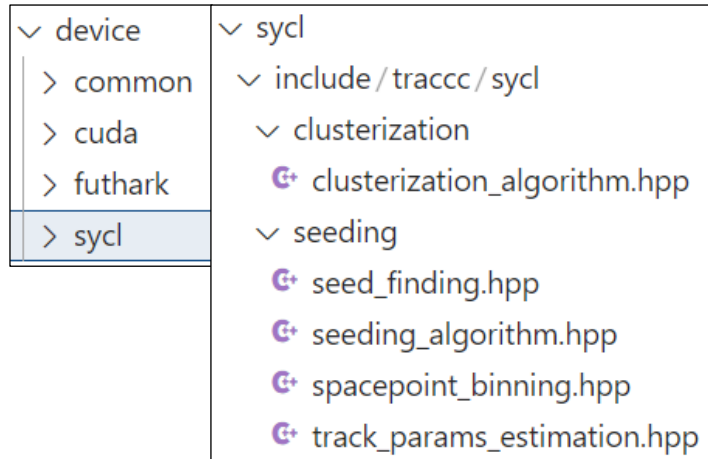
- ✓ device
 - > common
 - > cuda
 - > futhark
 - > sycl

Code model

∨ device	∨ common
> common	∨ include/traccc
> cuda	> clusterization/device
> futhark	> device
> sycl	> edm
	∨ seeding/device
	> impl
	🔗 count_doublets.hpp
	🔗 count_grid_capacities.hpp
	🔗 count_triplets.hpp
	🔗 find_doublets.hpp
	🔗 find_triplets.hpp
	🔗 make_doublet_buffers.hpp
	🔗 make_doublet_counter_buffer.hpp
	🔗 make_triplet_buffer.hpp
	🔗 make_triplet_counter_buffer.hpp
	🔗 populate_grid.hpp
	🔗 select_seeds.hpp
	🔗 update_triplet_weights.hpp

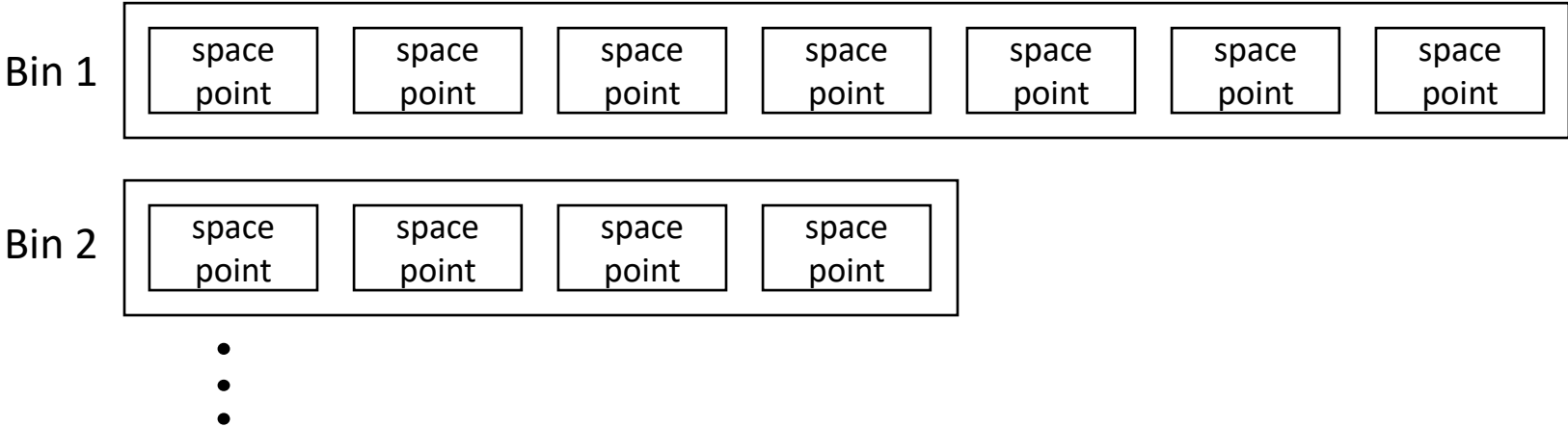
```
count_doublets.hpp 2, M × Settings
device > common > include > traccc > seeding > device > count_doublets.hpp > ...
22  /// Function used for calculating the number of spacepoint doublets
23  ///
24  /// The count is necessary for allocating the appropriate amount of memory
25  /// for storing the information of the candidates in a next step.
26  TRACCC_HOST_DEVICE
27  void count_doublets(
28      std::size_t globalIndex, const seedfinder_config& config,
29      const sp_grid_const_view& sp_view,
30      const vecmem::data::vector_view<const prefix_sum_element_t>& sp_ps_view,
31      doublet_counter_container_types::view doublet_view);
```

Code model

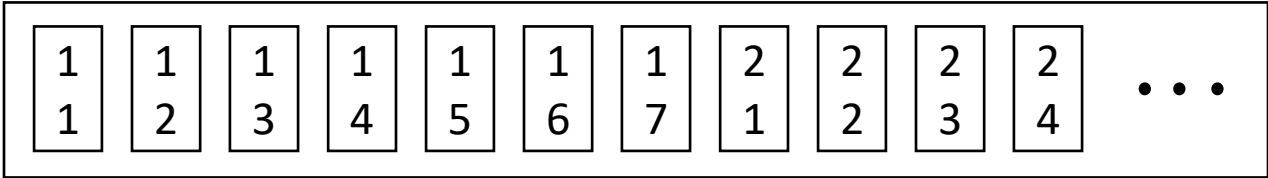


```
seeding_algorithm.hpp 4 × Settings
device > sycl > include > tracc > sycl > seeding > seeding_algorithm.hpp > ...
28  /// Main algorithm for performing the track seeding using oneAPI/SYCL
29  class seeding_algorithm : public algorithm<vecmem::data::vector_buffer<seed>(
30                               const spacepoint_container_types::const_view&>),
31                               public algorithm<vecmem::data::vector_buffer<seed>(
32                               const spacepoint_container_types::buffer&> {
```

Algorithms in a CPU vs GPU



Input jagged vector



Auxiliary vector for memory access

Algorithms in a CPU vs GPU

Use Dynamic memory allocation.

- Take input jagged vector
- Do calculations
- Append members to result jagged vector

Dynamic memory allocation in device not possible.

- 1st kernel - Create auxiliary vector for input
- 2nd kernel - Count number of members needed for result jagged vector
- 3rd kernel - Create auxiliary vector for counts
- 4th kernel - Fill result jagged vector

Effectively need to run calculations twice (2nd & 4th kernels)

Algorithms in a CPU vs GPU

```
seed_finding.cu 9+ x Settings
device > cuda > src > seeding > seed_finding.cu > {} tracc > {} cuda
37
38 /// CUDA kernel for running @c tracc::device::fill_prefix_sum
39 __global__ void fill_prefix_sum(
40     vecmem::data::vector_view<const device::prefix_sum_size_t> sizes_view,
41 >     vecmem::data::vector_view<device::prefix_sum_element_t> ps_view) { ...
46
47 /// CUDA kernel for running @c tracc::device::count_doublets
48 __global__ void count_doublets(
49     seedfinder_config config, sp_grid_const_view sp_grid,
50     vecmem::data::vector_view<const device::prefix_sum_element_t> sp_prefix_sum,
51 >     device::doublet_counter_container_types::view doublet_counter) { ...
56
57 /// CUDA kernel for running @c tracc::device::find_doublets
58 __global__ void find_doublets(
59     seedfinder_config config, sp_grid_const_view sp_grid,
60     device::doublet_counter_container_types::const_view doublet_counter,
61     vecmem::data::vector_view<const device::prefix_sum_element_t>
62     doublet_prefix_sum,
63 >     doublet_container_view mb_doublets, doublet_container_view mt_doublets) { ...
```

Clusterization in a CPU vs GPU

For each cell:

- Find clusters

For each cluster:

- Create measurements

For each measurement:

- Form 3D spacepoints out of 2D measurements

Clusterization in a CPU vs GPU

For each cell:

- Find clusters

For each cluster:

- Create measurements

For each measurement:

- Form 3D spacepoints out of 2D measurements

CPU code easily portable to GPU!

Seed finding in a CPU vs GPU

For each spMiddle:

- Look for compat spTop
- Look for compat spBottom
- Make triplets
- Filter triplets sharing this spM
- Make seeds

For each spMiddle:

- Look for compat spTop
- Look for compat spBottom
- Make doublets

For each midBot doublet:

- Look for compat midTop doublet
- Make triplets

For each triplet:

- Filter triplets sharing same spM
- Make seeds

Testing traccc

```
seq_example_sycl.sycl 9+ x Settings
examples > run > sycl > seq_example_sycl.sycl > ...
158 | /*-----
159 | | Clusterization & Spacepoint formation (SYCL)
160 | |-----*/
161 |
162 | /*time*/ auto start_clusterization_sycl =
163 | | std::chrono::system_clock::now();
164 |
165 | auto spacepoints_sycl_buffer = ca_sycl(cells_per_event_sycl);
166 |
167 | /*time*/ auto end_clusterization_sycl =
168 | | std::chrono::system_clock::now();
169 | /*time*/ std::chrono::duration<double> time_clusterization_sycl =
170 | | end_clusterization_sycl - start_clusterization_sycl;
171 | /*time*/ clusterization_sycl += time_clusterization_sycl.count();
172 |
173 | traccc::clusterization_algorithm::output_type measurements_per_event;
174 | traccc::spacepoint_formation::output_type spacepoints_per_event;
175 |
176 | if (run_cpu) {
177 | |
178 | | /*-----
179 | | | Clusterization (cpu)
180 | | |-----*/
```

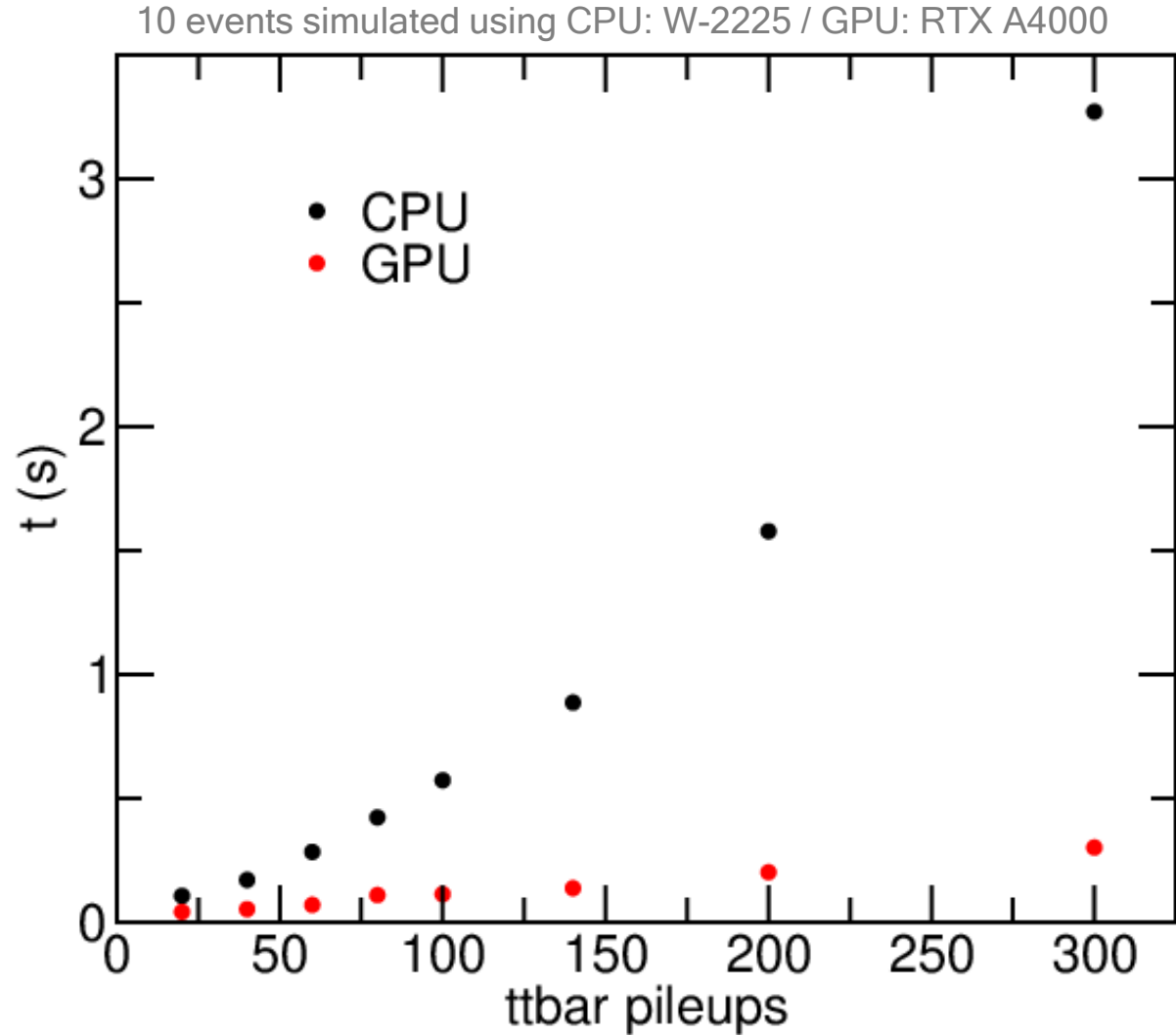
```
Running ./bin/traccc_seq_example_sycl tml_detect
or/trackml-detector.csv tml_full/ttbar_mu300/ 1
Running Seeding on device: NVIDIA RTX A4000
event 0
  number of seeds (cpu): 26743
  number of seeds (sycl): 26743
  measurements matching rate: 0.99957
  spacepoint matching rate: 0.96902
  seed matching rate: 0.955615
  track parameters matching rate: 0.999663
  clusterization_time (cpu) 0.0294396
  spacepoint_formation_time (cpu) 0.0031022
  clusterization_time (sycl) 0.0139178
  seeding_time (cpu) 0.298
  seeding_time (sycl) 0.0141859
  tr_par_esti_time (cpu) 0.00868278
  tr_par_esti_time (sycl) 0.00358893
```

Testing traccc

Parallelizing introduces a lot of complexity to coding

Testing full tracking chain from reading input data from detector to seeds

- GPU can significantly boost performance as quantity of data increases



Future steps

- Working on re-synchronising tracc with main Acts
- Re-thinking in parallel
- Add additional functionality to tracc
- Performance optimizations