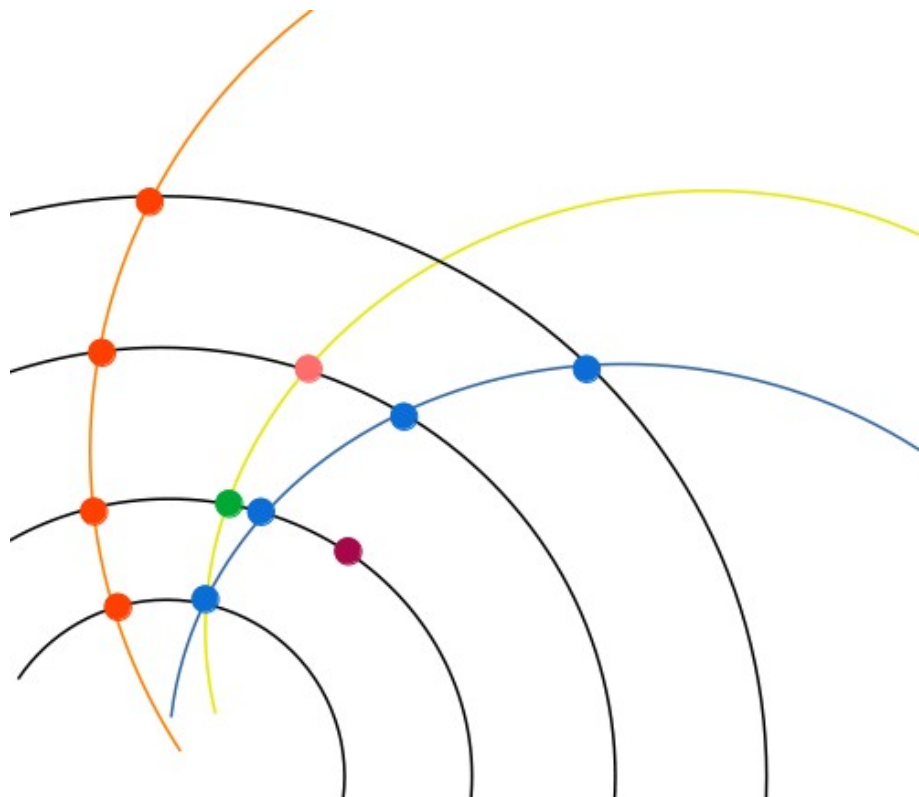


# (Combinatorial) KalmanFilter in



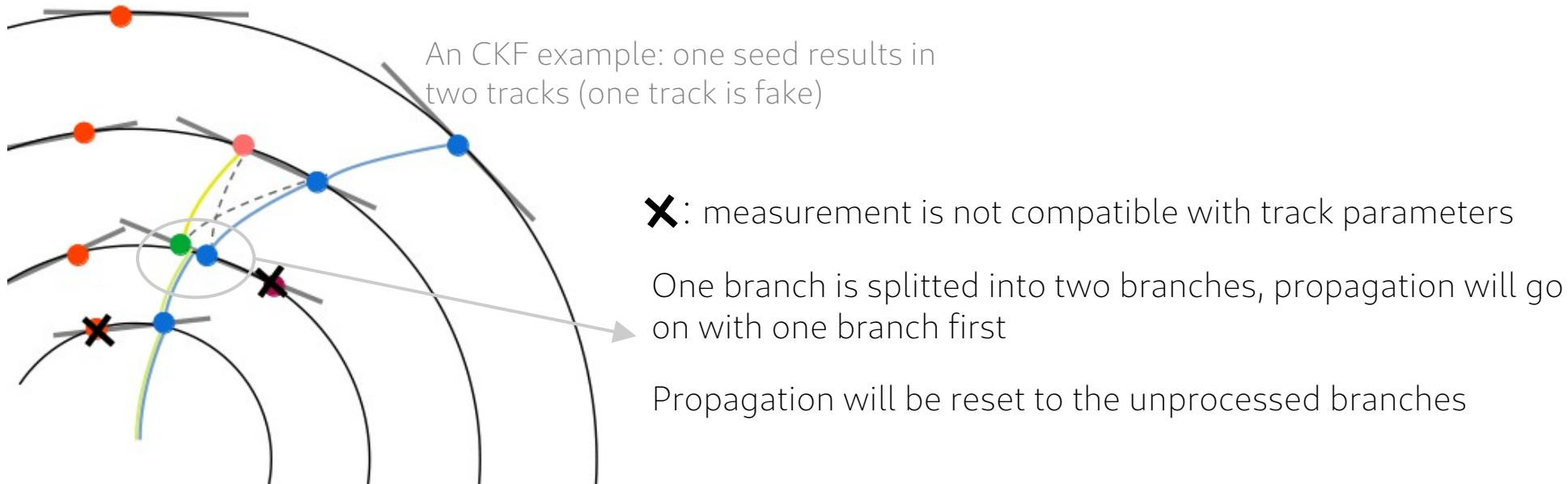
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# KF and CKF

- KF: track fitting for a found track
  - One seed results in 1 track if fitting succeeds
- CKF: track fitting + track finding simultaneously
  - Selection of measurements and propagation branching are involved
  - One seed might result in  $\geq 1$  track(s) if track finding succeeds



# KF invocation

```
template <typename source_link_iterator_t, typename start_parameters_t,  
         typename parameters_t = BoundTrackParameters,  
         bool _isdn = isDirectNavigator>  
auto fit(source_link_iterator_t it, source_link_iterator_t end,  
         const start_parameters_t& sParameters,  
         const KalmanFitterOptions<traj_t>& kfOptions,  
         std::shared_ptr<traj_t> trajectory = {}) const  
-> std::enable_if_t< !_isdn, Result<KalmanFitterResult<traj_t>>> {
```

Compile-time option to use direct navigation based on a sequence of surfaces

One “fit” takes:

- Begin and End Iterator for the input measurements (sourcelinks) of the track
- Starting parameters for the track
- KF options
- Optional existing MultiTrajectory to append the new track
  - This allows all tracks in one event to share a single MultiTrajectory (see #1507)

and returns:

- The MultiTrajectory for either only this track or prefitted tracks in this event
- The fitted track parameters for each track

# CKF invocation

```
template <typename source_link_iterator_t,  
         typename start_parameters_container_t,  
         typename parameters_t = BoundTrackParameters>  
std::vector<Result<CombinatorialKalmanFilterResult<traj_t>>> findTracks(  
    const start_parameters_container_t& initialParameters,  
    const CombinatorialKalmanFilterOptions<source_link_iterator_t, traj_t>&  
    tfOptions) const {
```

One “findTracks” takes:

- A set of starting parameters, e.g. the found seeds for one event
- CKF options (including sourcelink accessor, measurement selector...)

and returns:

- A single MultiTrajectory for all found tracks using the given seeds
- A vector of fitted track parameters for all found tracks

# KF/CKF options

Much improvement by Paul Gessinger-Befurt,  
Corentin Allaire and Tim Adye...

	Extensions	Other options
KF&CKF	<ul style="list-style-type: none"><li>• calibrator</li><li>• (Kalman) updater</li><li>• (Kalman) smoother</li></ul>	<ul style="list-style-type: none"><li>• Whether consider material effects</li><li>• Optional target surface (e.g. beam line or tracker exit) to retrieve fitted track parameters</li></ul>
KF-specific	<ul style="list-style-type: none"><li>• outlierFinder</li><li>• ReverseFilteringLogic (more sophisticated decision logic for smoothing approach)</li></ul>	<ul style="list-style-type: none"><li>• Perform “smoothing” using either smoothing formalism or backward filtering</li><li>• Scaling factor for track parameters covariance at the start of backward filtering</li><li>• Whether perform non-linear correction during global → local transformation</li></ul>
CKF-specific	<ul style="list-style-type: none"><li>• MeasurementSelector (allow eta/pt dependent selection cuts)</li><li>• branchStopper</li></ul>	<ul style="list-style-type: none"><li>• Sourcelink Accessor to retrieve a range of measurements for a given surface (in principle, it can include measurements in neighbor surface)</li><li>• Perform smoothing (can only use smoothing formalism) or not</li></ul>

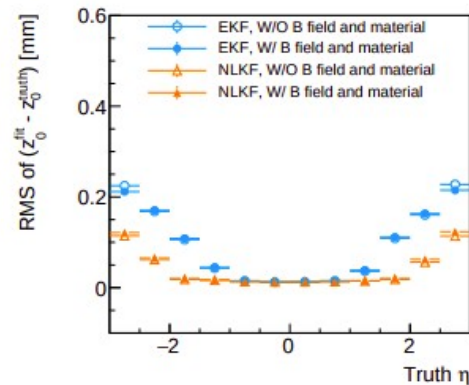
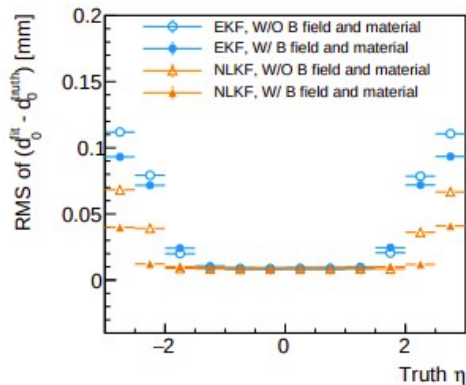
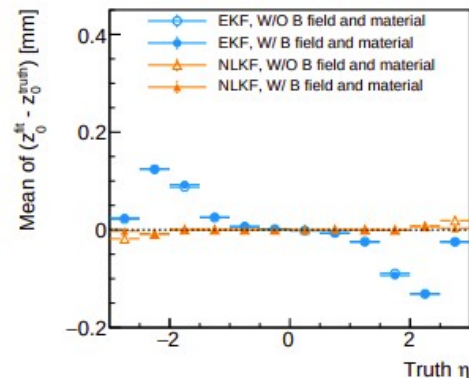
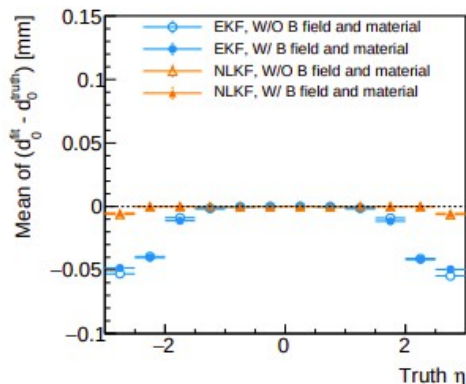
# KF non-linear extension

- Track parameters covariance is transported using Jacobian ( $J_{k-1 \rightarrow k}$ )
  - $C_k = J_{k-1 \rightarrow k} * C_{k-1} * J_{k-1 \rightarrow k}^T$
- One-order Jacobian might be insufficient when non-linear effects are significant (e.g. large incident angle)
- Idea of non-linear correction during global track parameters  $\rightarrow$  local track parameters
  - Generate a set of sample points for the global track parameters based on its covariance
    - This requires a reliable estimation of the track parameters covariance
  - Perform transformation for each sample point
  - Derive corrected local track parameters and its covariance

# KF performance

- Non-linear KF can correct the bias of fitted track parameters and improve their precision in a test scenario
- ~1.6X time of KF

Open Data Detector. ATLAS field

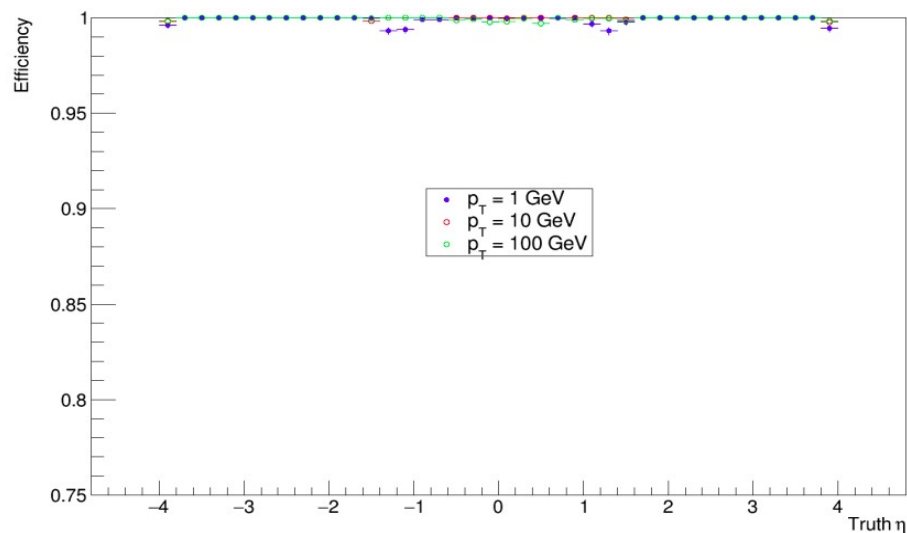


arXiv: 2112.09470

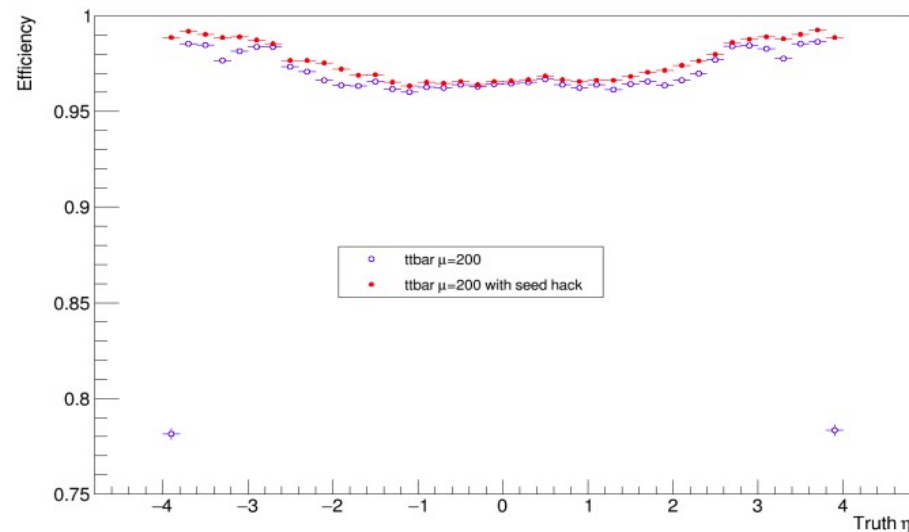
# CKF performance

See Tim Adye's slides [here](#)

- For example, >95% track find efficiency for  $t\bar{t}$  with  $\mu = 200$  for ATLAS ITk



- ATLAS ITk geometry, B-field map, material
- smeared hits digi (no HGTD)
- ITk seeding **with hack**, CKF
- 1k  $100\text{-}\mu^\pm$  events
- $p_T = 1, 10, 100$  GeV/c
- $|\eta| < 4$



- ATLAS ITk geometry, B-field map, material
- smeared hits digi (no HGTD)
- ITk seeding **with and without hack**, CKF
- 1k events:  $100\text{-}\mu^\pm$  and  $t\bar{t} + \mu = 200$
- $|\eta| < 4$



# Summary

- The KF and CKF have been much refactored and extended in the last year
  - This greatly simplifies and extends the usage
- CKF is being tested with more and more experiments, e.g. ATLAS Itk, FASER...
- Further validation and optimization, in particular the time performance, are needed