# Data-flow parallelism for high-energy and nuclear physics frameworks Kyle J. Knoepfel, Marc Paterno, Saba Sehrish, Chris Green Fermi National Accelerator Laboratory

#### **Data-flow parallelism**

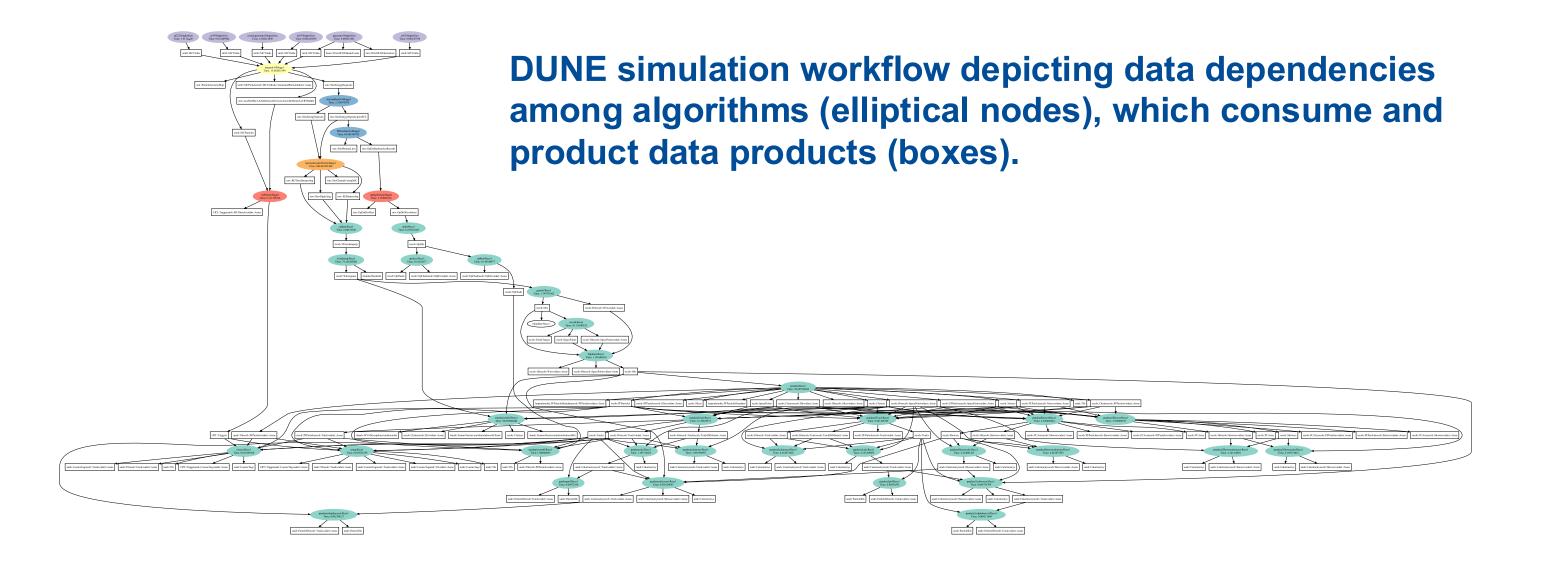
Computing workflows in high-energy and nuclear physics can generally be expressed as directed acyclic graphs according to the data dependencies among algorithms.

### **Collaborating with Intel oneTBB developers**

An LDRD project (**Meld**) explored using Intel's **oneTBB flow graph** and higher-order functions to process HENP data.



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Graph-based processing approaches are not often used in HENP due to implicit dependencies between algorithms, serialization among thread-unsafe libraries, and difficulties in short-circuiting processing with filters.

#### **Processing idioms**

HENP algorithms tend to very procedural, often obscuring the nature of the computation being performed. However, almost all algorithms can be expressed according to



As a result, meetings were established between Fermilab developers and Intel oneTBB flow graph developers to find ways to better support HENP.

Intel oneTBB flow-graph spec

## **Proposed new flow-graph functionalities**

**Serializer node:** sometimes thread-unsafe software must be invoked from multiple nodes. It's insufficient to specify a "serial" concurrency for each node as separate nodes can still be executed in parallel.

 Each thread-unsafe library has a dedicated node that sends and receives one token—the user's algorithm is not invoked until it receives the token.

Fold node: accepts multiple input messages (one per sequence element) and outputs one result per sequence.

https://github.com/oneapi-src/oneTBB/pull/1526

Folding node in the Flow Graph	
•	continue_node that converts multiple input signals (usually fr successors.
•	function_node converting each input message from one or se
•	multifunction_node converting each input signal into some a several successors.
	expressing the use-case converting multiple input signals (inpu existing API.
	h an API is extremely useful for expressing <i>reductions</i> (or <i>folds</i> )

- patterns using higher-order functions:
- **Transform:** A user-provided function f is applied to each data product in the sequence  $(a_j)$ , creating another sequence  $(b_j)$ .
- **Fold:** A subrun data product  $K_i$  is created by applying a user-provided fold operation g on each data product in the sequence  $(c_{i,j})$ .
- **Unfold:** A sequence of data products  $(d_{i,j})$  is produced by applying a user-provided unfold operation *h* on one subrun data product  $J_i$ .
- Filter: A user-provided predicate *p* is applied to each elements of the sequence (*c<sub>i</sub>*),

- Internal atomic counters to ensure fold result emitted at the right time
- oneTBB created RFC to explore adding this to the flow-graph library

Intel RFC for fold nodes

**Filtering support:** oneTBB considering the addition of a class template tbb::optional\_msg<T>, with potential short-circuiting behavior for disengaged ("null") objects.

## Next steps

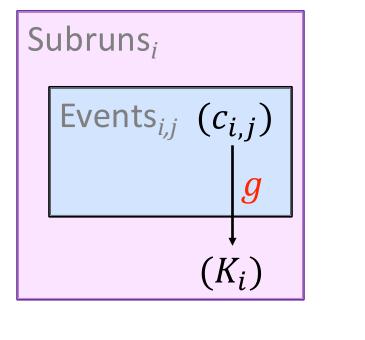
Our work was presented 10 October 2024 at the **UXL oneAPI DevSummit**.



The DUNE experiment is pursuing a framework that uses graph-based processing and higher-order functions.

oneTBB flow-graph developers are executing Meld benchmarks to test new ideas.

Some challenges remain (e.g.):



 $(J_i)$ 

 $(d_{i,j})$ 

 $(C_j)$ 

Subruns<sub>i</sub>

Events<sub>i,i</sub>

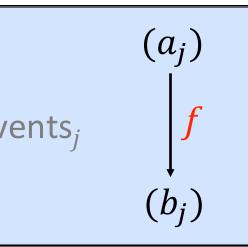
Events<sub>i</sub>

 $(a_j)$ 

 $(a_j | \phi_j) \longleftarrow (\phi_j)$ 

eval

 $(a_k)$ 



creating a sequence of Boolean results  $(\phi_i)$ .

The sequences  $(a_j)$  and  $(\phi_j)$  zipped together and then evaluated to yield a possibly shorter new sequence  $(a_k)$ .

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- Pairing physics data with calibration information of independent periods of validity.
- Efficiently and safely invoking Python algorithms from algorithms wrapped by flow-graph nodes.
- Re-expressing existing algorithms and behaviors using higher-order functions.

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