# Developments in Performance and Portability of BlockGen 

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## Event Generators for LHC Simulation



- Event Generators implement the perturbative QCD calculations and use Monte Carlo methods to generate particle interactions.
- They are the first step in the simulation chain for collider experiments.


## Motivation

- The needs of the computing resources grows rapidly when moving into the HL-LHC era
- Could only stay within the budget under the Aggressive R\&D scenario - ATLAS HL-LHC Computing CDR
- Reduce the per event generation time
- Utilize GPU resources besides the CPUs

- Modern architecture environment includes many different configurations of hardware, portable software helps alleviate the need for rewriting algorithms for each.
- In the future every geographic will have their own custom chips.



## Brief Intro to Blockgen Algorithm

- Matrix Element (ME) calculation represents most of the computing time spent in precision event generation.
- We studied a new set of fast algorithms for ME calculation
- Helicity sum, amplitudes and color sum
- Details in Max's talk in this session
- Implemented in CUDA for early tests
- Here the improvements can be seen in one of the costliest processes for LHC event generation: $\mathbf{V}+\mathbf{N}_{\text {out }}$ jets
- Compares with existing CPU codes (Comix, Amegic)

arXiv:2106.0650
- Shows factor $\sim 10$ speedup at low particle multiplicity, factor $\sim 4$ at high multiplicity. (with fully loaded CPU and GPU)


## Portability with Kokkos

- Writing code in CUDA only runs on NVidia GPUs
- Abstraction libraries like Kokkos, Alpaka, Sycl [Intel] provides portability for the
- Same code to be run on both CPU and GPU with Reasonable performance compared to the native language

As of March 2022


- Kokkos was used largely based on experience and evidence of achievable performance and portability
- Kokkos offers abstracted, templated memory management, and parallel kernel launching
- It is an Exascale project funded by US-DOE, not aligned to any particular industry hardware.
- Our codes are written by physics theorists, not software engineers, making readability very important.
- DOE HEP-CCE has presented on portability frameworks [ref] Poster at ACAT


## Example of Kokkos Abstraction

- Kokkos offers a memory management abstraction called a View class:

```
Kokkos::View<int*> d_array(10); // Device-side array
auto h_array = Kokkos::create_mirror_view(d_array) // host-side array
Kokkos::deep_copy(h_array,d_array); // copy from device to host (swap for inverse)
```

- Kokkos offers methods for running parallel algorithms:

```
int team_size = 128; // like threads per block in CUDA or OMP_NUM_THREADS in OpenMP
int league_size = 1000; // like number of blocks in CUDA
using member_type = typename Kokkos::TeamPolicy<Kokkos::DefaultExecutionSpace>::member_type;
Kokkos::TeamPolicy<Kokkos::DefaultExecutionSpace> policy(league_size,team_size);
Kokkos::parallel_for("helicity_loop",policy,
    KOKKOS_LAMBDA(const member_type& team_member)|
        int \overline{ievt = team_member.league_rank() * team_member.team_size() + team_member.team_rank();}
        // some algorithm that runs in parallel
}); // end of parallel code
```


## Event Throughput vs Parallel Threads




- Measure the event throughput with various combinations of threads*blocks on different hardware.
- The plateau is easily identified on the NVidia V100 (left) and A100 (right)
- GPU is fully filled at this point


## Event Throughput vs Parallel Threads



- Measure the event throughput with various combinations of threads*blocks on different hardware.
- The plateau is easily identified on the AMD MI100 (left) and Intel Skylake (right) as well
- The plateau is majorly based on the No. of threads/block rather than the total threads in case of the Skylake
- The peak varies based on the process and hardware


## Performance of Kokkos

- So, does Kokkos provide equivalent performance?
- Plot shows early versions of BlockGen calculating the process: $\mathrm{gg} \rightarrow \mathrm{njets}$
- Time per Event on y-axis, number of outgoing partons on x -axis
- Compare CPU with C++, GPU with CUDA, and GPU with Kokkos
- Can see the CUDA is 100 x faster than the CPU for this example
- Kokkos is slightly less performant than CUDA at low multiplicity (low computational complexity), but reaches comparable performance as multiplicity increases.


## Hardware Comparison

- Tested Kokkos implementation with benchmarking processes
- ttbar + jets \& W+jets
- Kokkos with CUDA backend on Nvidia GPUs
- Kokkos with OpenMP backend on AMD and Intel CPUs
- Kokkos with ROCM/HIP backend on AMD GPUs
- Used the serial C++ algorithm run with MPI to fill a Skylake for comparison to original
- Caveat: no time has yet been spent studying differences



## Hardware Comparison

Dependence on the complexity of the process

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## Hardware Comparison

Comparable performance when moving to high jet multiplicity

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## Summary

- New Algorithms that can utilize accelerators for HEP simulation are needed to achieve the scientific goals of the LHC in a timely fashion.
- Blockgen is such an algorithm.
- Kokkos offered a relatively pain free method for writing physics algorithms that run on multiple architectures and maintain reability.
- While the performance of Kokkos may not be equal to native frameworks, it gets within 10\% in the computationally intensive algorithms.
- Kokkos is not an industry product, it comes from the HPC scientific community and can be extended as needed to support future architectures.



## Next Steps

- The Matrix Element calculations have been ported to Kokkos
- The performance will be investigated in collaboration with the Kokkos developers who are very helpful.
- Now we need to integrate these into a proper Leading-Order Event Generator.
- This work is largely done on the C++ side.
- Physics validation



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## Backups

## Z $\rightarrow$ ee (+gluon jet)




Total threads launched
Argonne Leadership Computing Facility


 Total threads launched


## ttbar (+gluon jets)







## Kokkos vs CUDA vs CPU - latest BlockGen version

- Compare CPU with C++, GPU with CUDA, and GPU with Kokkos
- Can see the CUDA is $\sim 10-100$ times faster than the CPU for this example
- Kokkos has a negligible overhead comparing to CUDA at low multiplicity (low computational complexity), but reaches comparable performance as multiplicity increases.


