

# CSR-based Graph Traversal Accelerator on HMC

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## Introduction

- Graph traversal is adopted in a wide variety of realistic scenarios. However, because of the terrible spatial locality, graph traversal is quite time-consuming
- Conventional prefetch technology and parallel framework do not bring much benefit. Fortunately the well-defined structure graph structure leaves chance for explicit prefetchers. The only problem is to accelerate this process
- We proposed **CGAcc**, a CSR-based [1] graph traversal accelerator on HMC, which deploys three prefetchers working in a pipeline style cooperatively to reduce transaction latency

## CGAcc

- CGAcc acts like a master rather than a slave, which means what CPU side needs to do is only send a start request. After the request is accepted by CGAcc, it will continue fetch data until all nodes are accessed
- CGAcc needs the support of several external modules
  - Activation Register**, used as a trigger to wake CGAcc up; **Continual Register**, used to store the current maximum start node index
  - On-chip Caches** are used as buffers for vertex, edge and visited array to reduce transaction latency
  - Prefetcher groups** work like cycle in pipeline way. Except access registers periodically, VEP receives work list info from VSP and send vertex data to EP; EP receives vertex info from VEP and send edge data to VSP; VSP receives edge info from EP and send new node index data to VEP

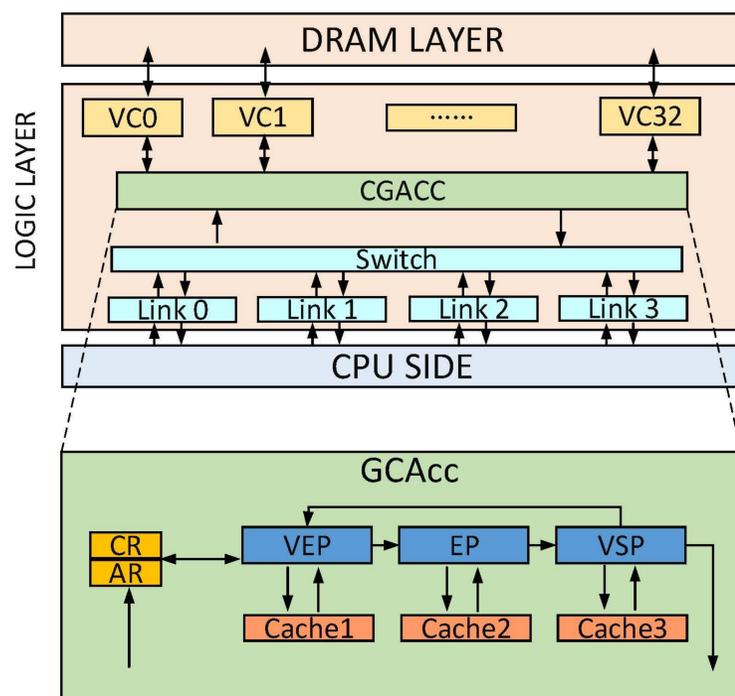


Figure 2. The architecture of HMC and CGAcc

## CSR-based Graph Traversal

- A work node index leads to the corresponding two locations (index and index + 1) in **vertex array**. These two values which fetched from vertex arrays illustrate the range that the data should take from edge array
- Then **edge array** will be accessed. Similarly, the edge data will also be used as the index for the visited array
- Finally, the **visited array** will be accessed to determine whether this extended node has been accessed or not, and if not, this node will be pushed into the work list as a new node

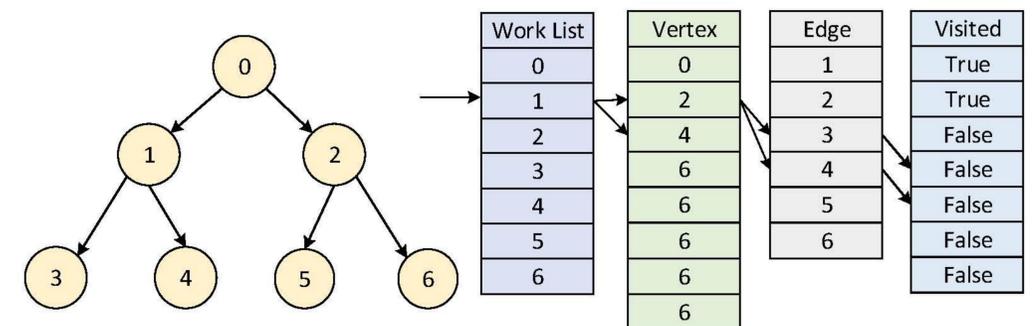


Figure 1. CSR graph traversal work flow.

## Results

- We perform the experiments on the cycle-level CasHMC [2] simulator, and make the necessary micro-architectural modifications. We evaluate on several workloads from Graph-BIG [3]
- The results are shown in Figure 3. The average speedup can reach 2.8X. Respectively, for real-world workloads, the average speedup is 2.84X while the speedup shows as 2.70X for synthetic workloads

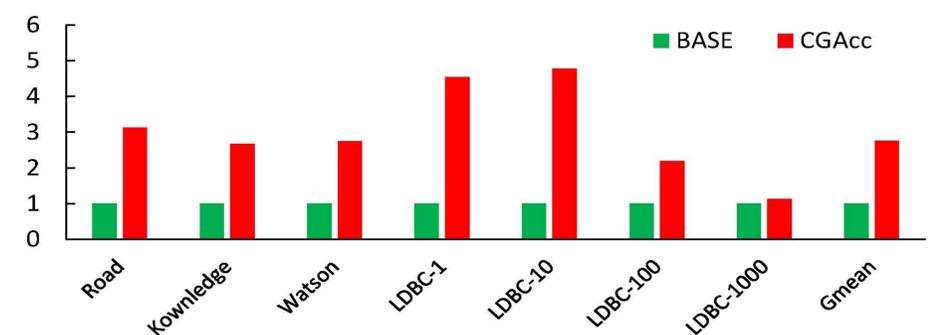


Figure 3. Comparison of performance on several graph workloads.

## References

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