



Polytech Paris-UPMC

#### Merge and sort project in CUDA

Presentation

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#### The steps of our work:



- Understanding the merge and sort method in GPU
- Implementation of the partitioning
- Implementation of the merge and sort
- Application on a dataset
- Performance analysis of our implementation
- How can we improve our program?

## Understanding the merge and sort methods in GPU

#### GPU Merge Path - A GPU Merging Algorithm

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#### ABSTRACT

Graphics Processing Units (GPUs) have become ideal candidates for the development of fine-grain parallel algorithms as the number of processing elements per GPU increases. In addition to the increase in cores per system, new memory hierarchies and increased bandwidth have been developed that allow for significant performance improvement when computation is performed using certain types of memory access patterns.

accompaniements overted arrays is a useful primitive and is a basic building block for numerous applications such as joining database queries, merging adjacency lists in graphs, and set intersection. An efficient parallel merging algorithm partitions the sorted input arrays into sets of non-overlapping sub-arrays that can be independently merged on multiple cores. For optimal performance, the partitioning should be each core receives an equal size of data to merge.

In this paper, we present an algorithm that partitions the workload equally amongst the GPU Streaming Multi-processors (SM). Following this, we show how each SM performs a parallel merge and how to divide the work so that all the GPU's Streaming Processors (SP) are utilized. All stages in this algorithm are parallel. The new algorithm demonstrates good utilization of the GPU memory hierarchy. This approach demonstrates an average of 20X and 50X speedup over a sequential merge on the x86 platform for integer and floating point, respectively. Our implementation is 10X faster than the fast parallel merge supplied in the CUDA Trust library.

#### Categories and Subject Descriptors

C.4 [Computer Systems Organization]: Special-Purpose and Application-Based Systems

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#### Keywords

Parallel algorithms, Parallel systems, Graphics processors, Measurement of multiple-processor systems

#### 1. INTRODUCTION

The merging of two sorted arrays into a single sorted array is straightforward in sequential computing, but presents challenges when performed in parallel. Since merging is a common primitive in larger applications, improving performance through parallel computing approaches can provide benefit to existing codes used in a variety of disciplines. Given two sorted arrays A,B of length |A|,B| respectively, the output of the merge is a third array C such that C contains the union of elements of A and B, is sorted, and |C| = |A| + |B|. The computational time of this algorithm on a single core is O[|C|] [2]. As of now, it will be assume that |C| = |C|

The increase in the number of cores in modern computing systems presents an opportunity to improve performance through clever parallel algorithm design; however, there are numerous challengs that need to be addressed for a parallel algorithm to achieve optimal performance. These challenges include evenly partitioning the workload for effective load balancing, reducing the need for synchronization mechanisms, and minimizing the number of redundant operations caused by the parallelization. We present an algorithm that meets all these challeness and more for GPU systems.

The remainder of the paper is organized as follows: In his section we present a brief introduction to GPU systems, merging, and sorting. In particular, we present Merge Path [8, 7], Section 2 introduces our new GPU merging algorithm, GPU Merge Path, and explains the different granularities of parallelism present in the algorithm. In section 3, we show empirical results of the new algorithm on two different GPU architectures and improved performance over existing algorithms on GPU and x86. Section 4 offers concluding remarks.

#### 1.1 Introduction on GPU

Graphics Processing Units (GPUs) have become a popular platform for parallel computation in recent years following the introduction of programmable graphics architectures like NVIDIA's Compute Unified Device Architecture (CUDA) [6] that allow for easy utilization of the cards for purposes other than graphics rendering. For the sake beweity, we present only a short introduction to the CUDA architecture. To the authors' knowledge, the parallel merge in the Thrust



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### MergePath concept

- Input: 2 sorted arrays
- Orange path = comparison decisions=> merged output array
- Black point = median of output array

		B[1]	B[2]	B[3]	B[4]	B[5]	B[6]	B[7]	B[8]
		16	15	14	12	9	8	7	5
A[1]	13	1	1	1	0	0	0	0	8
A[2]	11	1	1	1	1	0	0	V	0
A[3]	10	1	1	1	1	0	Ø	0	0
A[4]	6	1	1	1	1	1	1	1	0
A[5]	4	1	1	1	1	1	1	1	1
A[6]	3	1	1	1	1	1	1	1	1
A[7]	2	1	1	1	1	1	1	1	1
A[8]	1	/	1	1	1	1	1	1	1

### Implementation of the partitioning

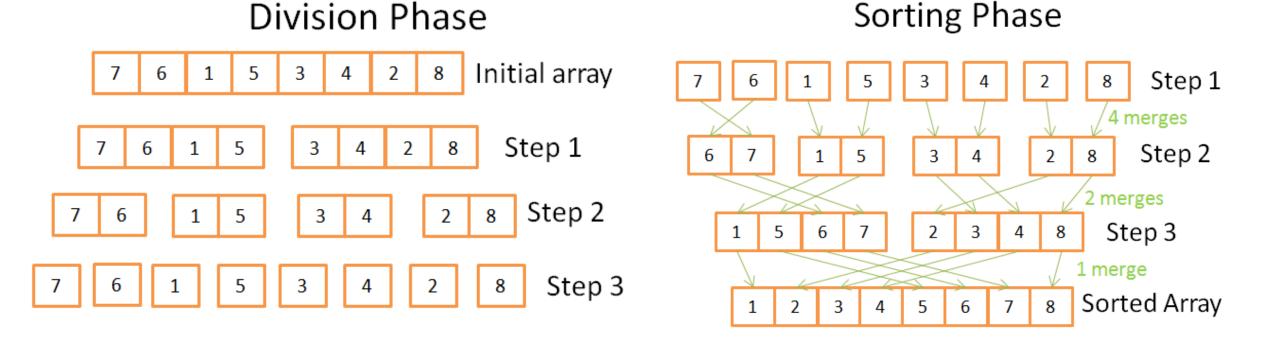
Followed the algorithm (binary search)

Algorithm 1 Pseudo code for parallel Merge Path algorithm with an emphasis on the partitioning stage.

```
A_{diag}[threads] \Leftarrow A_{length}
B_{diag}[threads] \Leftarrow B_{length}
for each i in threads in parallel do
  index \Leftarrow i * (A_{length} + B_{length}) / threads
  a_{top} \Leftarrow index > A_{length} ? A_{length} : index
  b_{top} \Leftarrow index > A_{length}? index - A_{length}: 0
  a_{bottom} \Leftarrow b_{top}
   // binary search for diagonal intersections
   while true do
     offset \Leftarrow (a_{top} - a_{bottom})/2
      a_i \Leftarrow a_{top} - offset
     b_i \Leftarrow b_{top} + offset
      if A[a_i] > B[b_i - 1] then
        if A[a_i-1] \leq B[b_i] then
           A_{diag}[i] \Leftarrow a_i
            B_{diag}[i] \Leftarrow b_i
            break
         else
           a_{top} \Leftarrow a_i - 1
           b_{top} \Leftarrow b_i + 1
         end if
      else
         a_{bottom} \Leftarrow a_i + 1
      end if
   end while
end for
for each i in threads in parallel do
  merge(A, A_{diag}[i], B, B_{diag}[i], C, i * length/threads)
end for
```

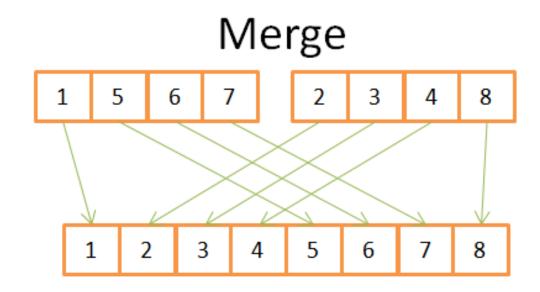
### Implementation of the merge and sort

Implemented sorting phase in sequential



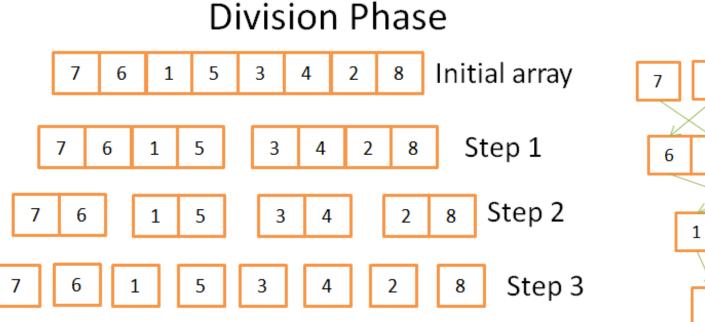
## Implementation of the merge

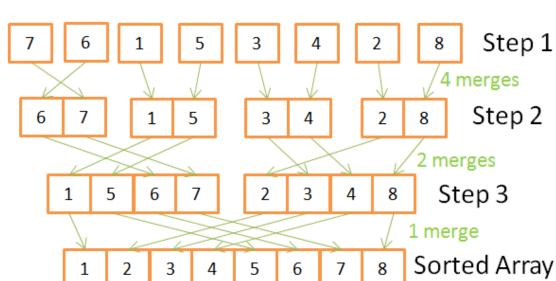
Merge two sorted arrays



### Implementation of the merge and sort

Adapted in GPU with partitioning





Sorting Phase

#### Application on a dataset

Created an interactive menu

```
Quitter
Help
Test sur tableau random
Lecture à partir d'un fichier
Exemple d'application données automobiles
Retour menu principal
Appuyer sur une touche entre 0 et 5 puis valider avec la touche ENTREE
```

- Test with random array of size N (choice)
- Test with file reading
- Test with a dataset

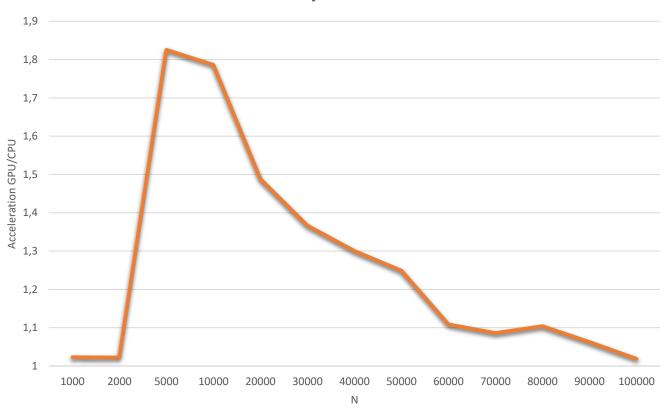
#### Used cars dataset

- Data preprocessing with python-pandas
- Data reading
- Algorithm application
- Output:
  - Top 10 most expensive cars
  - Top 10 most kilometers



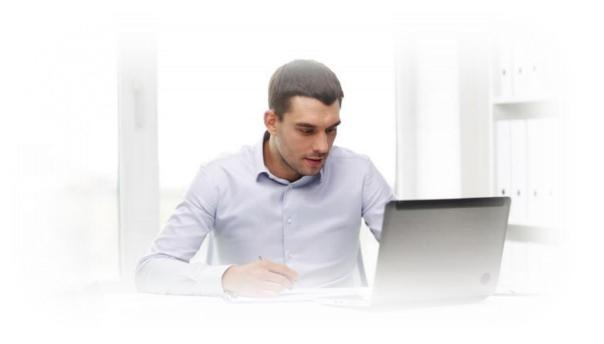
# Performance analysis of our implementation

#### Acceleration GPU/CPU in fonction of N



### How can we improve our program

- Parallelization of the sort
- w-wide binary search?
- w-partition search?







### Thank you for your attention