

Generating a Shortest B -Chain using Multi-GPUs

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Abstract: Let B be a finite set of binary operations over the set of natural numbers $\mathbb{N}$. A B -chain for a natural number n , denoted by $BC(n)$, is a sequence of numbers $1 = c_0, c_1, \dots, c_l = n$ such that for each $i > 0$, $c_i = c_j \circ c_k$, where $0 \leq j, k \leq i-1$ and $\circ$ is an operation of B . Generating a shortest B -chain for n plays an important role in increasing the performance of some cryptosystems and protocols. This paper has two purposes. The first is to propose a generic algorithm to generate a shortest B -chain using a single CPU and a single GPU for any B . The second is to propose two strategies to improve the generation of a shortest B -chain using two (or more) GPUs. Using two GPUs, the experimental study shows that the first strategy improves the performance by about 20%, while the second strategy improves the performance by about 30 ~ 35% in case of $B = \{+\}$. It is also possible to combine both strategies when we have at least four GPUs.

Keywords: B -chain, addition Chain, addition-subtraction chain, addition-multiplication chain, Branch-and-Bound, GPU, CUDA, Depth-First Strategy, Breadth-First Strategy

1 Introduction

Given a natural number n , and an element g in some groups G , computing g^n with the minimal number of operations is equivalent to the problem of finding a sequence of elements such that the sequence starts with 1, which represents g , terminates with n , which represents g^n , and each other element in the sequence comes from two preceding elements (not necessarily different) in G using the binary operation defined on G . Formally, let B be a finite set of binary operations over the set of natural numbers. A B -chain [1] for a natural number n , denoted by $BC(n)$, is a sequence $1 = c_0, c_1, \dots, c_l = n$, such that for each $i > 0$, $c_i = c_j \circ c_k$, where $0 \leq j, k \leq i-1$ and $\circ$ is an operation of B . The number l is called the length of $BC(n)$. A $BC(n)$ is called a shortest if its length is minimal. Let $\ell^B(n)$ denotes the length of a shortest B -chain.

Designing an efficient algorithm to generate a shortest B -chain plays an important role in increasing the efficiency of some public key cryptosystems and protocols [2, 3, 4, 5] that used the operation g^n in their computations.

A B -chain is considered a mathematical model for studying the complexity of evaluating integers and polynomials [1, 6]. The most important types of B -chains are:

1. *addition chain* [7], denoted by AC or BC^+ , when $B = \{+\}$. Generating a shortest addition chain for n plays an important role in speeding up modular exponentiation $g^n \bmod m$, where $g \in Z_m$ is an element in the multiplicative group of integers modulo a positive integer m .

For example, computing g^{51} using $BC^+(51) : 1, 2, 4, 8, 16, 32, 48, 51$ can be done as follows:

$$g, g^2 = g * g, g^4 = g^2 * g^2, g^8 = g^4 * g^4, g^{16} = g^8 * g^8, g^{32} = g^{16} * g^{16}, g^{48} = g^{32} * g^{16}, g^{50} = g^{48} * g^2, g^{51} = g^{50} * g.$$

This computation requires 8 multiplications, while the following computation requires 7 multiplications using the $BC^+(51) : 1, 2, 3, 6, 12, 24, 48, 51$.

$$g, g^2 = g * g, g^3 = g^2 * g, g^6 = g^3 * g^3, g^{12} = g^6 * g^6, g^{24} = g^{12} * g^{12}, g^{48} = g^{24} * g^{24}, g^{51} = g^{48} * g^3.$$

2. *addition-subtraction chains* [7], denoted by ASC or $BC^\pm$, when $B = \{+, -\}$, i.e., each element in a chain can be written as summation or subtraction of two previously elements $c_i = c_j \pm c_k, j, k < i$. Addition-subtraction chains [2] are similar to addition chains in that they are used to compute $n \cdot g$, where n is a scalar and g is a point on elliptic curve E over a finite field $\mathbb{F}$. For example, if $n = 63$, then we can find $BC^\pm(n) : 1, 2, 4, 8, 16, 32, 64, 63$. The last element

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$c_7 = c_6 - c_0$. Thus, computing $63 \cdot P$ can be done as follows: $P, 2 \cdot P, 4 \cdot P, 8 \cdot P, 16 \cdot P, 32 \cdot P, 64 \cdot P, 63 \cdot P$, where $63 = 64 - 1$. Note that a shortest $BC^+(63)$ is $1, 2, 3, 6, 12, 15, 30, 60, 63$, and so $\ell^+(63) \geq \ell^\pm(63)$. In general, $\ell^\pm(n) \leq \ell^+(n)$.

3. *addition-multiplication chains* [8,9,10], denoted by AMC or BC^* , when $B = \{+, *\}$, i.e., each element in a chain is a summation or multiplication of two previously elements $c_i = c_j *^+ c_k, j, k < i$. For example, $BC^*(63) : 1, 2, 3, 6, 7, 9, 63$, and so $\ell^+(63) \leq \ell^\pm(63) \leq \ell^+(63)$. Clearly, $\ell^+(n) \leq \ell^+(n)$.

4. *Euclidean addition chains* [11], denoted by EAC . It is a special case of addition chains where $c_2 = 3$, and for $2 \leq i \leq l-1$, if $c_i = c_{i-1} + c_j$ for some $j \leq i-2$, then $c_{i+1} = c_i + c_{i-1}$ or $c_{i+1} = c_i + c_j$. EAC has application in performance of some elliptic curve cryptosystem [12]. Herbaut and P. Véron [13] proposed a public key cryptosystem with security based on EAC . Efficient generation of EAC may lead to the cryptanalysis of Herbaut-Véron cryptosystem.

In general, generating a shortest B -chain is NP-hard problem [14,15]. There are two directions to generate BC . The first is to generate a short BC , while the other is to generate a shortest BC . In this paper, we concentrate on a shortest BC . From practical view, generating a shortest B -chain is important when n is not very large or it is a fixed number for a period of time. Otherwise, one can generate a short B -chain [3,7,16].

The majority of studies in the literature have focused on generating a shortest BC^+ . For examples, Thurber [17] developed a fast branch and bound depth first search (BB-DFS) algorithm to find a BC^+ by presenting three (pruning bounds) bounding sequences and two types of pruning techniques to cut off some elements in the search tree that cannot lead to a BC^+ . Bahig [18,19] improved Thurber's work by determining some conditions for a step c_i to be in the form $c_i = c_{i-1} + c_j, j < i$, and the lower bound of j , and k when we generate $c_i = c_j + c_k, j, k < i-1$. Thurber and Clift [20] generalized two pruning bounds of Thurber's result [17]. Bahig and Abdelbari [21] proposed a GPU-based algorithm to generate a shortest BC^+ .

On other sides, a few works have been done on generating shortest BC^* [8,9], and EAC [12,13].

Parallel computing [22,23,24] is used to speedup generation of a shortest or short BC^+ . Graphics processing units (GPUs) play a main role in parallel computing in different domains, such as cryptanalysis [25], and bioinformatics [26].

The purposes of this paper are (1) uses of GPUs to present a general algorithm to generate any type of B -chains with minimal length; and (2) proposing two

strategies to speed up the generation using multi-GPUs and multi-threads.

Compared to using a single GPU, the two proposed strategies accelerate the generation by about 20, and 30 ~ 35% respectively.

The remainder of the paper is organized as follows. In Section 2, we present a general algorithm to generate a shortest B -chain. It is a generalization of the algorithm developed by Bahig and Abdelbari [21] to generate a shortest addition chain. The proposed algorithm can work on any type of B -chain. In Section 3, we propose the first strategy to use multi-GPUs to increase the performance of generating a shortest B -chain. In Section 4, we propose the second strategy. Section 5 describes the implementation details of the two strategies. Finally, Section 6 includes the conclusion of the paper.

2 Generating a Shortest B-Chain using GPU

In this section, we present a general algorithm to generate a shortest B -chain. It is a generalization of the algorithm proposed by Bahig and Abdelbari [21]. The algorithm starts with computing a lower bound lb , of BC , and then generating a short BC . Thus, the length of the generated short BC is the upper bound of the depth of the search tree, i.e., if no a BC with length $lb < ub$ is found, then the generated short BC is shortest and so the algorithm terminates. The search tree is divided into three parts (subtrees) as shown in Fig. 1:

1. Top tree (**TTree**) which employs the central processing unit, CPU, to perform branch and bound depth first search strategy (**BB-DFS**) see Algorithm 1.
2. Middle tree (**MTree**) which employs the CPU to perform the branch and bound breadth first search algorithm (**BB-BFS**), see Algorithm 2.
3. Bottom tree (**BTree**) which employs the GPU to perform the branch and bound depth first search strategy (**BB-DFS**), see Algorithm 3.

The detailed description of each part is similar to that described in [21] but for $B = \{+\}$. Algorithm 1 describes the search tree to generate a shortest BC , where

- B refers to the type of B -chains.
- lower-bound- $BC(n, B)$ returns a lower bound of $BC(n)$. For example, if $B = \{+\}$, then we have [7,27]

$$lb \geq \lceil \log_2 n + \log_2 HW(n) - 2.13 \rceil,$$

where HW denotes to the Hamming weight, i.e., number of "1" bit in the binary representation of n . While if $B = \{+, *\}$, then we have [8]

$$lb \geq \log_2 \log_2 n + 1.$$

Similarly for $B = \{+, -\}$, see [28].

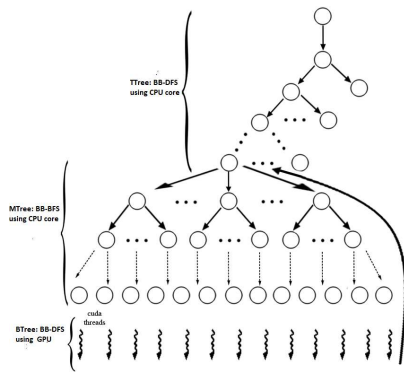


Fig. 1: GSBC: General strategy to generate a shortest BC using GPU

- $\text{upper-bound-BC}(n, B)$ returns a short B -chain, and its length. In case of $B = \{+\}$, we can use one of the methods that generates a short addition chain such as [7, 29, 30]. Similarly, for $B = \{+, *\}$, we can use the r -ary method [8], while the methods in [2, 31] for $B = \{+, -\}$.
- $\text{Bounding-sequences}(n, B, lb)$ returns bounding sequences, if exists, for n with length lb , where a bounding sequence (or prune bounds) is a sequence of numbers $\{p_i\}_{i=0}^{lb}$ of length lb to determine a lower bound of each c_i in any B -chain of length lb , i.e., $c_i \geq p_i, 0 \leq i \leq lb$. In the literature, bounding sequences for BC^+ are proposed by Thurber [17] and improved by Thurber and Clift [20], while Bahig [9] presented a bounding sequence for BC^+ . Until now, there is no proposed bounding sequence for $BC^\pm$. The main difficulty in finding a bounding sequence for $BC^\pm$ is that it is not increasing sequence.
- $\text{DetermineDepthLevel}(n, B, lb)$ returns the estimated depth of **TTTree**, see [21] for example. The estimation of DepthLevel should consider the available memory storage, otherwise we need to use another strategy, such as in [25], for **MTTree**.
- $DStack$ is a stack to hold each element and its level in the search tree using **DFS**.

3 The First Strategy

In this section, we present the first strategy to improve the generation of a shortest B -chain using multi-GPUs. The strategy is based on using two (or more) GPUs at **BTTree**. When the number $|QueueElem_GPU|$ of generated children (paths) using **MTTree** is sufficiently large, we distribute the generated elements $QueueElem_GPU$ to some or all available GPUs such that each of them has sufficient data to work efficiently. Let α denotes the number of available GPUs, and β denotes the minimum number of elements (paths) to occupy each GPU assuming that all GPUs have the same specification. The

Algorithm 1 GSBC: Generate a shortest B -chain for n

```

Ensure:  $BC$ : shortest  $BC(n)$ .
1:  $CurBC[0] \leftarrow 1$ ;
2:  $CurBC[1] \leftarrow 2$ ;
3:  $lb \leftarrow \text{lower-bound-BC}(n, B)$ ;
4:  $BC, ub \leftarrow \text{upper-bound-BC}(n, B)$ ;
5: while  $(lb < ub)$  do
6:    $BS \leftarrow \text{Bounding-sequences}(n, B, lb)$ ; ▷ TTTree: BB-DFS
7:    $DepthLevel \leftarrow \text{DetermineDepthLevel}(n, B, lb)$ ;
8:    $CurLevel \leftarrow 1$ ;
9:   loop
10:    if  $CurLevel < DepthLevel$  then
11:       $DStack \leftarrow \text{Push all possible children of } CurBC[0..CurLevel]$ 
        (associated with their levels  $CurLevel + 1$  and) generated by  $op \in B$  and retained
        by  $BS$ ;
12:    end if
13:    if  $DStack$  is not empty then
14:       $(CurLevel, CurBC[CurLevel]) \leftarrow \text{Pop}(DStack)$ ;
15:    else
16:      Exit the inner loop;
17:    end if
18:    if  $CurLevel = DepthLevel$  then ▷ MTTree: BB-BFS
19:       $(QueueElem\_GPU, CurLevel) \leftarrow$ 
         $\text{Generate\_Child\_BBBFS}(CurBC, CurLevel, lb, n, BS, B)$ ;
20:      if  $QueueElem\_GPU$  is not empty then
21:        if  $CurLevel = lb$  then
22:          return a shortest  $BC(n)$ ;
23:        else ▷ BTTree: BB-DFS
24:           $\text{GPU\_BBDFS}(QueueElem\_GPU, CurLevel, FoundBC, BC, n, BS, B)$ 
25:          if  $FoundBC = \text{true}$  then
26:            return  $BC$ 
27:          end if
28:        end if
29:      end if
30:    end if
31:  end loop
32:   $lb = lb + 1$ ;
33: end while
34: return  $BC$ 

```

Algorithm 2 $\text{Generate_Child_BBBFS}(CurBC, CurLevel, lb, n, BS, B)$

```

Ensure:  $List\_Paths\_for\_GPU$ 
1:  $List\_Paths\_for\_GPU \leftarrow \text{insert}(CurBC)$ 
2: while  $CurLevel < lb$  and  $List\_Paths\_for\_GPU$  is not empty do
3:    $CurLevel \leftarrow CurLevel + 1$ ;
4:    $List\_Paths\_for\_GPU \leftarrow \text{Generate all possible children for each path in}$ 
      $List\_Paths\_for\_GPU$ 
5:   if the conditions for GPU are satisfied then
6:     return  $List\_Paths\_for\_GPU$ ;
7:   end if
8: end while
9: return  $List\_Paths\_for\_GPU$ ;

```

Algorithm 3 $\text{GPU_BBDFS}(ListPaths_GPU, CurLevel, FoundBC, BC, n, BS, B)$

```

Require: FoundBC, BC;
Each GPU thread has the following local variables:
 $ThrdStack$ : stack to hold elements and their levels;
 $ThrdCurPath$ : current path;
 $ThrdCurLevel$ : current level
1: start threads sufficient for all elements of  $ListPaths\_GPU$ ;
2:  $ThrdCurPath \leftarrow ListPaths\_GPU[ThreadUniqueId]$ ;
3:  $ThrdCurLevel \leftarrow CurLevel$ ;
4: repeat parallelly
5:   each thread push children of  $ThrdCurPath[0..ThrdCurLevel]$  in  $ThrdStack$ 
     (associated with  $ThrdCurLevel + 1$ );
6:   if  $ThrdStack$  is not empty (i.e.,  $ThrdCurLevel > CurLevel$ ) then
7:      $(ThrdCurLevel, ThrdCurBC[ThrdCurLevel]) \leftarrow \text{Pop}(ThrdStack)$ ;
8:   else
9:     End of the thread;
10:  end if
11:  if  $ThrdCurLevel = lb$  then
12:    FoundBC = true;
13:    Atomically make  $BC = ThrdCurBC$ ;
14:    Announce all other threads to stop;
15:  end if
16: until  $ThrdStack$  is empty
17: FoundBC = false;

```

$QueueElem_GPU$ generated from **TTree** is distributed to GPUs as follows:

```

 $\gamma \leftarrow \alpha.$ 
while ( $\frac{|QueueElem\_GPU|}{\gamma} < \beta$ ) do
 $\gamma \leftarrow \gamma - 1$ 
end while
Copy about  $\lceil \frac{|QueueElem\_GPU|}{\gamma} \rceil$  to each GPU.

```

Fig. 2 shows the idea of this strategy when we have two GPUs. We use CPU-Core-1 for both **TTree** and **MTree** using **BB-DFS** and **BB-BFS**, respectively. While we use GPU-1 and GPU-2 for **BTree** using **BB-DFS**.

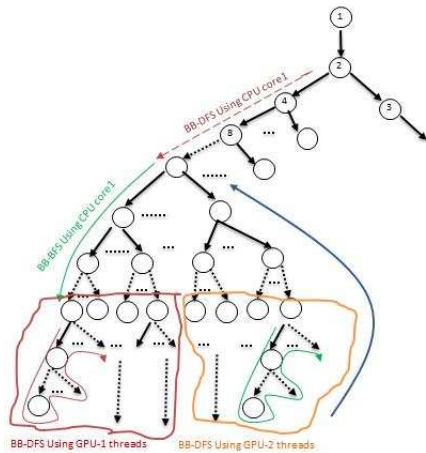


Fig. 2: The first strategy

4 The Second Strategy

In this section, we propose another efficient strategy to improve the generation of a shortest BC using two (or more) GPUs. The strategy is based on our observation that "there is usually a difference between $\ell^B(n)$ and lb ". For example, let $n = 170089$. There is no shortest addition chain for n with length $lb = 20$, but there is with the length $lb = 21$. The algorithm **GSBC** tries to find a $BC(n)$ of length lb . If **GSBC** couldn't find a B -chain with the length lb , then it increases lb by 1 and repeats the process. Thus, our strategy is to run **GSBC** using one core and one GPU to find a $BC(n)$ of length lb , and also to run **GSBC** using another core and another GPU to find a $BC(n)$ of length $lb + 1$, and so on. Suppose that we have two GPUs. Our strategy is to run at the same time **GSBC** using two cores (say, core-1, and core-2) and two GPUs (say, GPU-1, and GPU-2). The CPU core-1 with GPU-1 tries to find a $BC(n)$ of length lb , while the CPU Core-2 with GPU-2 tries to find a $BC(n)$ of length $lb + 1$. There are two cases:

1. If Core-1 (with GPU-1) finished before core-2 (with GPU-2). In this case, we have two subcases:
 - (a) Core-1 found a shortest B -chain. Thus, **GSBC** terminates core-2 and returns the shortest B -chain.
 - (b) There is no $BC(n)$ of length lb . Thus, **GSBC** waits until core-2 (with GPU-2) ends. If core-2 finds a $BC(n)$ of length $lb + 1$, then **GSBC** returns the founded chain as a shortest B -chain. Otherwise, i.e., core-2 didn't find a shortest $BC(n)$, we have to start core-1 with depth $lb + 2$, and core-2 with depth $lb + 3$, and repeat the process. Note that, in the case where the depth of the search tree is equal to ub , then there is no need to continue the search.
2. Otherwise, core-2 (with GPU-2) finished before core-1. In this case, core-2 should wait until core-1 terminates, and then we have two subcases:
 - (a) If core-1 finds a $BC(n)$ of length lb , then it returns the shortest $BC(n)$.
 - (b) Otherwise, core-2 returns a shortest $BC(n)$ of length $lb + 1$, if one exists. If both cores didn't find a $BC(n)$, then repeat the process, i.e., core-1 (with GPU-1) searches for a $BC(n)$ of length $lb + 2$, and core-2 (with GPU-2) searches for a $BC(n)$ of length $lb + 3$.

Fig. 3 shows our main idea.

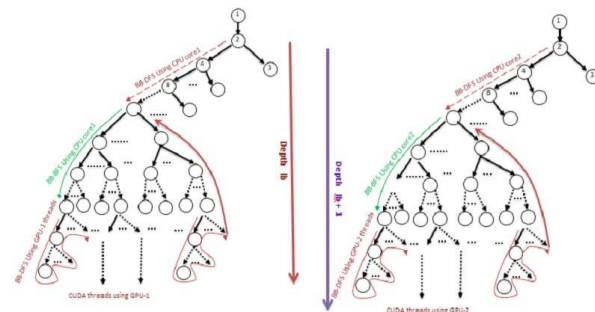


Fig. 3: The second strategy

5 Experimental Results

This section describes our implementation of the two strategies. We choose $B = \{+\}$. The implementation was conducted on a PC with Intel core i7-10870H CPU 2.21 GHz, 16 GB RAM, Windows 10 and Visual Studio 2013. The PC is coupled with two NVIDIA GeForce GTX 3060 [32]. The programs are written in the CUDA C. The CUDA C is an extension of the standard C language that used to access the GPU. We take $\alpha = 2$, $\beta = 1024$.

Table 1 shows the performance of the proposed strategies for 200 random m -bit numbers, where

$m = 16, 18, 20, 22, 24$.

The first strategy speeds up the generation by about 19 ~ 21%, while the second strategy speeds up the generation by 30 ~ 35%. Both strategies increase with an increasing the number of bits in the input number n , and, in particular, with an increasing Hamming weight of n . The performance of the second strategy increases more than the first since usually the difference between $\ell^B(n)$ and lb increases as n increases and so the second strategy will be more effective.

Table 1: Comparison in times (secs) between using a single GPU and using 2-GPUs with different strategies

Algorithm GSBC	m -bits				
	16	18	20	22	24
single GPU	0.88	3.46	27.83	193.47	386.01
2-GPUs + Strategy 1	0.71	2.75	22.01	152.48	304.7
2-GPUs + Strategy 2	0.62	2.39	18.95	129.41	251.17

6 Conclusion

We have presented a general (generic) algorithm for generating a shortest B -chain using GPU. It can be used to generate any type of B -chain. Then, we have suggested two strategies to improve the generation using multi-GPUs. The experimental results show that using two GPUs, the first strategy reduces the average time by about 20%, while the second strategy reduces the average time by about 30 ~ 35% compared to using a single GPU. It is possible to combine the two strategies to get more performance, but this requires two cores and four GPUs.

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Competing interests:

The authors declare that they have no competing interests.

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