



Week 6

Prefix Sum and Parallel Sort

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Prefix Sum

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A *prefix sum* is an algorithm that is applied to the elements of an n-element array of numbers, and its output is an n-element array that's obtained by adding up the elements “preceding” the current element.

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Example



• 5	1	6	2	4
• 5	6	12	14	18

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Sequential Code

```
1. int serial_prefixsum(double* a, int n) {  
2.   for (int i = 1; i < n; i++) {  
3.     a[i] = a[i] + a[i - 1];  
4.   }  
5.   return 1;  
6. }
```

- Is there any dependence?

- How can you parallelize this?

- Have we seen anything similar?

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Exclusive prefix sum, element 0 is 0, and the other elements are obtained by adding the preceding element of the array to the most recently computed element of the prefix sum array

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Example



• 5 1 6 2 4

• 5 6 12 14 18

• 0 5 6 12 14

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Parallel Prefix: A pictorial view – down step



3	1	7	0	4	1	6	3
	+		+		+		+
3	4	7	7	4	5	6	9
			+				+
3	4	7	11	4	5	6	14
							+
3	4	7	11	4	5	6	25

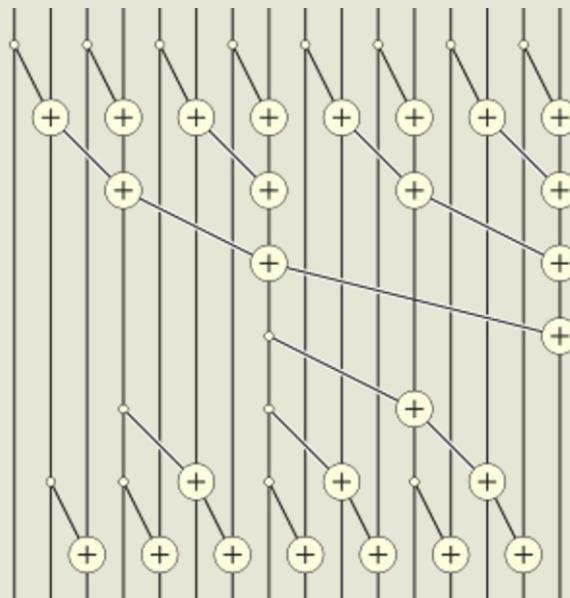
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Parallel Prefix: A pictorial view – up step



3	4	7	11	4	5	6	25
					+		
3	4	7	11	4	16	6	25
		+		+		+	
3	4	11	11	15	16	22	25

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Parallel Prefix Sum – Brent Kung Algorithm

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It is left as self-study assignment to read Kogge-Stone algorithm and compare with Brent Kung Algorithm.

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A more efficient Prefix Sum

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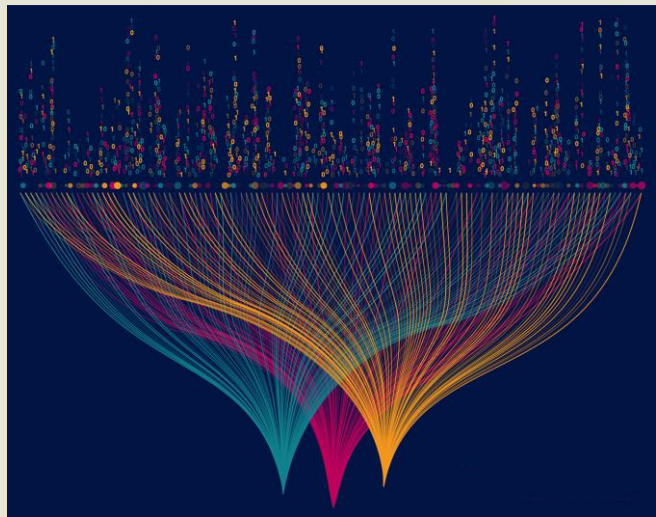


Any problem with Brent Kung Algorithm?

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Data >>> CPUs
(cores)
available



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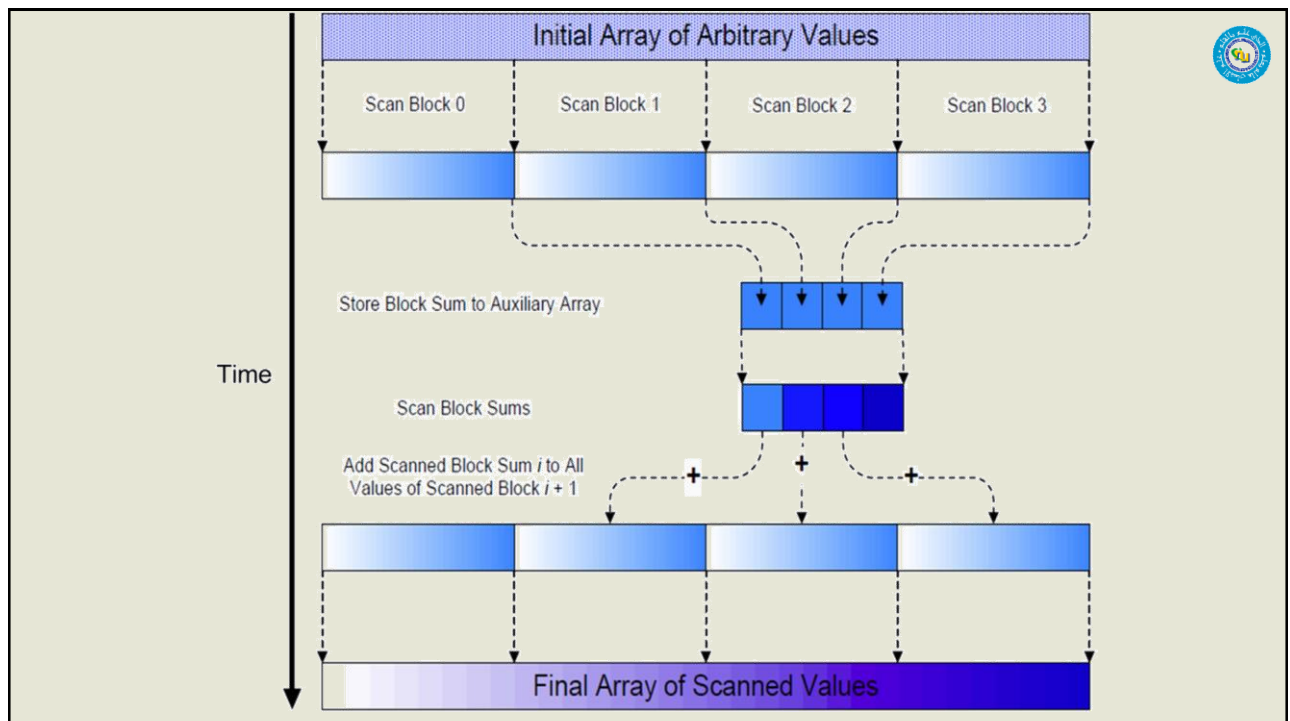
Thre Phase Prefix Adder



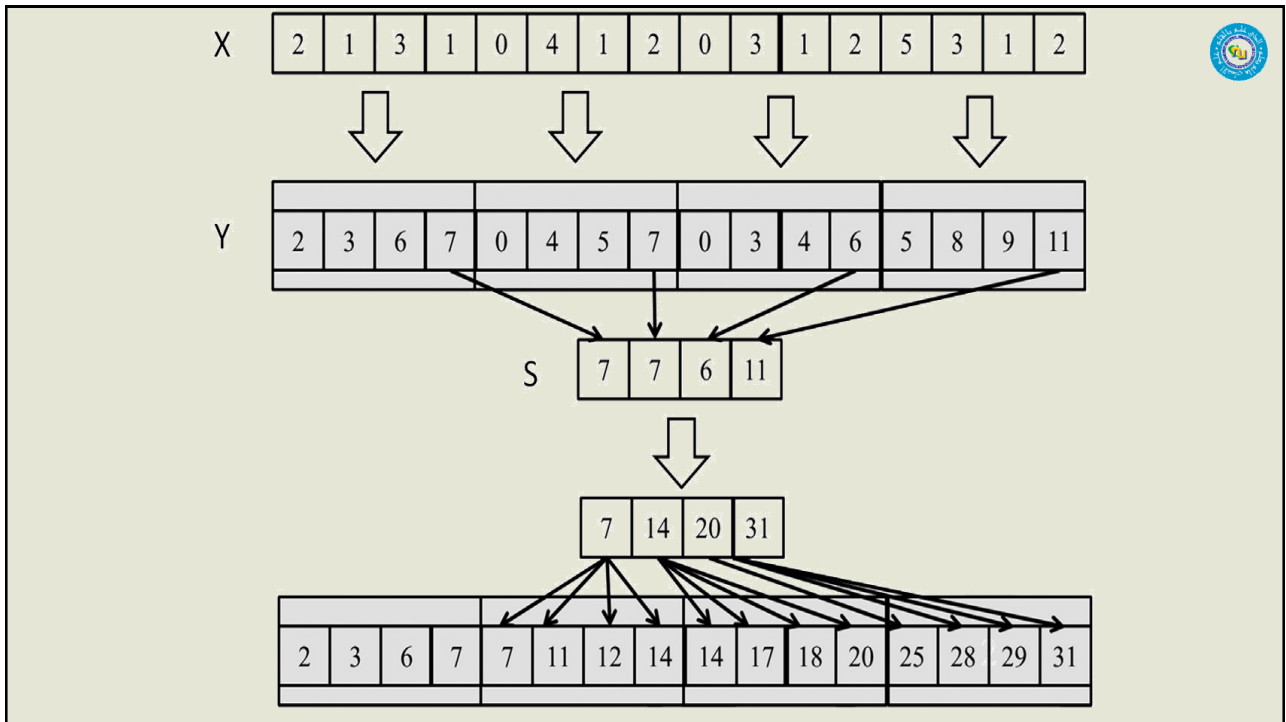
2	1	3	1	0	4	1	2	0	3	1	2	5	3	1	2
---	---	---	---	---	---	---	---	---	---	---	---	---	---	---	---

Phase 1: Scan sub arrays on individual CPUs

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Prefix Sum in MPI

- MPI_Scan is an inclusive scan:
 - Performs a prefix reduction across all MPI processes in the given **communicator**.

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Prefix Sum in MPI



- In other words, **each** MPI process receives the result of the reduction operation on the values passed by that MPI process and all MPI processes with a lower rank.

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Prefix Sum in MPI



- MPI_Scan is a **collective operation**;
 - it must be called by all MPI processes in the communicator concerned.
- The variant of MPI_Scan is the exclusive version ***MPI_Exscan***.

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```

1.  int MPI_Scan(
2.      _In_ void          *sendbuf,
3.      _Out_ void         *recvbuf,
4.      int                count,
5.      MPI_Datatype       datatype,
6.      MPI_Op             op,
7.      MPI_Comm           comm
8.  );

```

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Parameters



- **sendbuf** [in]: Starting address of send buffer.
- **recvbuf** [out]: Starting address of receive buffer.
- **count**: Number of elements in input buffer.
- **datatype**: Datatype of elements of input buffer.
- **op**: Operation.
- **comm**: Communicator.

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Return Value



- Returns `MPI_SUCCESS` on success. Otherwise, the return value is an error code.

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Exclusive Scan



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Adders and Algorithms



- Kogge-Stone Adder →
- Hillis Steele algorithm
- Brent-Kung Adder →
- Blelloch

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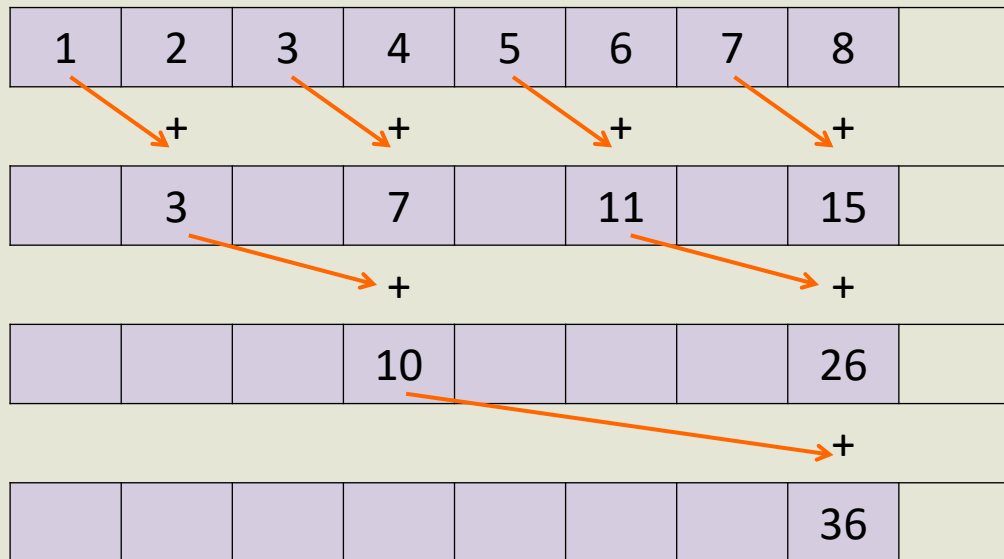
Recall exclusive scan



- *Exclusive prefix sum*, element 0 is 0, and the other elements are obtained by adding the preceding element of the array to the most recently computed element of the prefix sum array
- | | | | | |
|----|---|---|----|----|
| •5 | 1 | 6 | 2 | 4 |
| •0 | 5 | 6 | 12 | 14 |

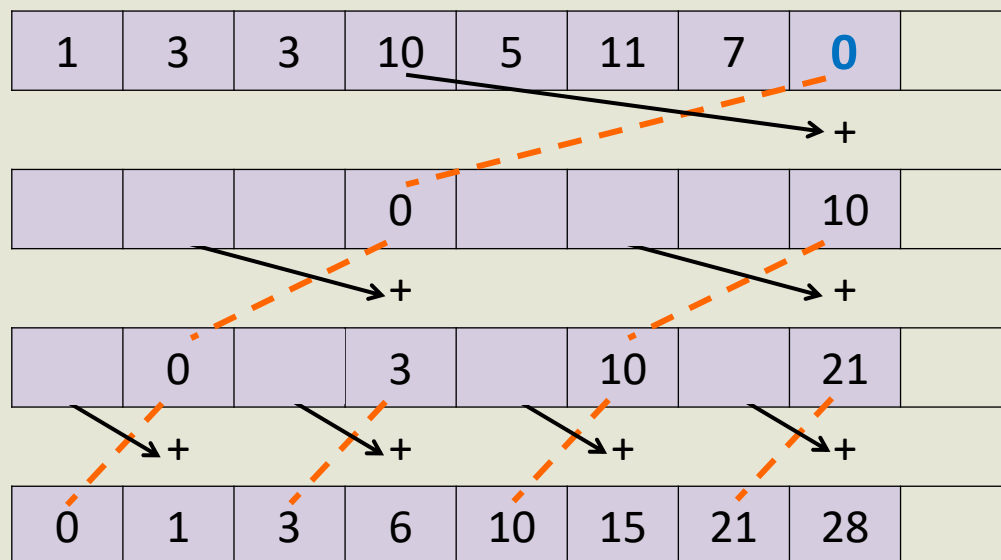
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Blelloch Parallel Exclusive Scan: A pictorial view – reduction step

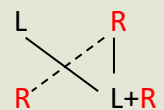


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Blelloch Parallel Exclusive Scan : A pictorial view – down sweep



**DOWN SWEEP
OPERATOR:**



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Complexity Analysis

Hillis-Steel vs Blelloch

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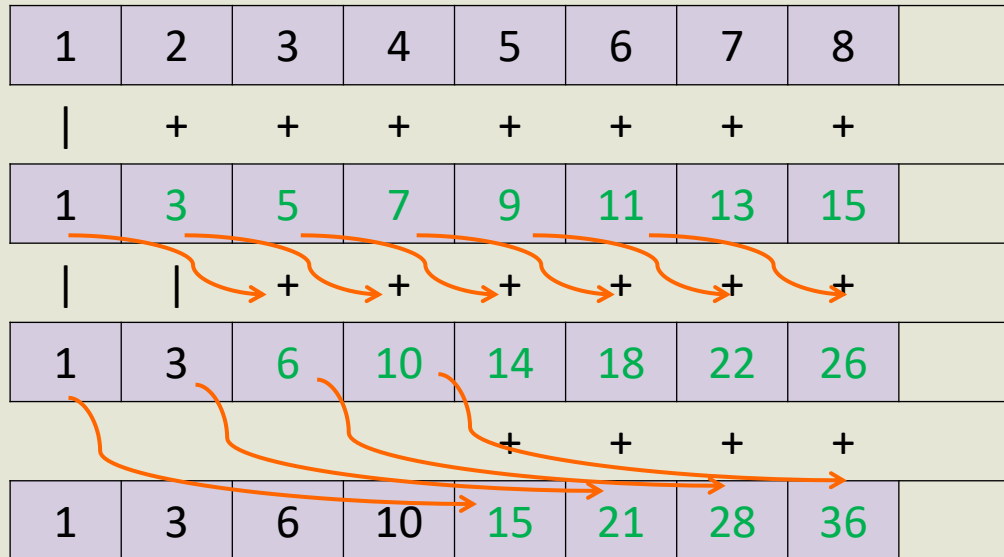


Some definitions

- **Depth $D(n)$** = "# of iterations/steps" = parallel running time $T_p(n)$
- **Work $W(n)$** = total number of operations performed by all threads together
 - With sequential algorithms, work complexity = time complexity
- **Work-efficient:**
 - A parallel algorithm is called work-efficient, if it performs no more work than the sequential one

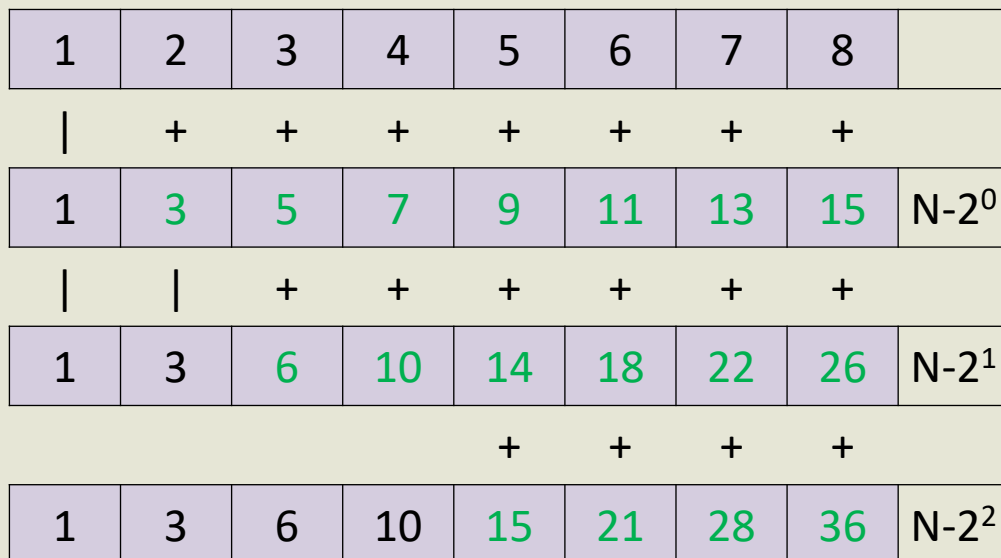
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Hillis-Steele Parallel Inclusive Scan: A pictorial view



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Hillis-Steele Parallel Inclusive Scan: Complexity



NUMBER OF STEPS:
 $\log(n)$

AMOUNT OF WORK
 $n-2^0 +$
 $n-2^1 +$
 $n-2^2 +$
 \dots
 $\frac{1}{2} N$

Around N work
in each step.

$n \log(n)$

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Blelloch Parallel Scan: Complexity



1	2	3	4	5	6	7	8	
---	---	---	---	---	---	---	---	--

NUMBER OF STEPS:
 $2 \times \log(n) = O(\log n)$

	+		+		+		+	$n/2^1$
--	---	--	---	--	---	--	---	---------

AMOUNT OF WORK

	3		7		11		15	
--	---	--	---	--	----	--	----	--

$2 \times n = O(n)$

			+				+	$n/2^2$
--	--	--	---	--	--	--	---	---------

			10				26	
--	--	--	----	--	--	--	----	--

Note: once for
 reduction step and
 then for down-sweep

							+	$n/2^3$
--	--	--	--	--	--	--	---	---------

							36	
--	--	--	--	--	--	--	----	--