Arhitecturi Paralele
Complexitate + Măsurare Timpi

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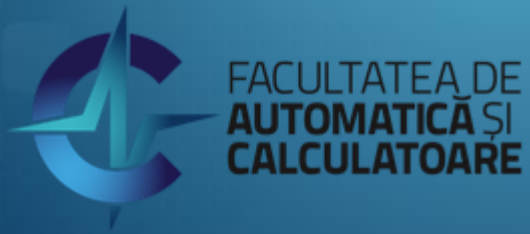
Elemente preluate din cursul Prof. Ciprian Dobre



Măsurarea timpului de execuție

time ./executabil p a r a m e t r i

Măsurare timp – Linia de comandă

time *sleep 5*

real 0m5.001s
user 0m0.000s
sys 0m0.001s

time sleep 5

sleep 5 0.00s user 0.00s system 0% cpu 5.002 total

/usr/bin/time sleep 5

0.00user 0.00system 0:05.00elapsed 0%CPU (0avgtext+0avgdata 2076maxresident)k
0inputs+0outputs (0major+73minor)pagefaults 0swaps

Măsurare timp – Linia de comandă

***time** sleep 5*

real 0m5.001s
user 0m0.000s
sys 0m0.001s

Wall clock time – Timpul trecut de la pornirea programului – Pe acesta îl folosim

time sleep 5

sleep 5 0.00s user 0.00s system 0% cpu 5.002 total

/usr/bin/time sleep 5

0.00user 0.00system 0:05.00elapsed 0%CPU (0avgtext+0avgdata 2076maxresident)k
0inputs+0outputs (0major+73minor)pagefaults 0swaps

Măsurare timp – Linia de comandă

time sleep 2

real 0m2.0**21**s
user 0m0.000s
sys 0m0.000s

time sleep 2

real 0m2.0**18**s
user 0m0.000s
sys 0m0.016s

time sleep 2

real 0m2.0**16**s
user 0m0.000s
sys 0m0.000s

time sleep 2

real 0m2.0**15**s
user 0m0.000s
sys 0m0.000s

Timpii măsurați nu sunt exacți. Pentru a măsura corect trebuie să facem medie a timpilor după mai multe rulări sau să considerăm doar timpi mari – peste o secundă.

Măsurare timp – Linia de comandă

***time** sleep 5*

real 0m5.001s
user 0m0.000s
sys 0m0.001s

Suma timpului petrecut în user space pe fiecare core.

time sleep 5

sleep 5 0.00s user 0.00s system 0% cpu 5.002 total

/usr/bin/time sleep 5

0.00user 0.00system 0:05.00elapsed 0%CPU (0avgtext+0avgdata 2076maxresident)k
0inputs+0outputs (0major+73minor)pagefaults 0swaps

Măsurare timp – Linia de comandă

Suma timpului petrecut în user space pe fiecare core.

time timeout 5 ./useAllCPU 12

real 0m4.075s
user 0m47.797s
sys 0m0.031s

Măsurare timp – Linia de comandă

***time** sleep 5*

real 0m5.001s
user 0m0.000s
sys 0m0.001s

Suma timpului petrecut în kernel pe fiecare core.

time sleep 5

sleep 5 0.00s user 0.00s system 0% cpu 5.002 total

/usr/bin/time sleep 5

0.00user 0.00system 0:05.00elapsed 0%CPU (0avgtext+0avgdata 2076maxresident)k
0inputs+0outputs (0major+73minor)pagefaults 0swaps

Măsurare timp – Linia de comandă

Orice I/O este făcut de Kernel

```
time dd if=/dev/zero of=file.txt count=1024 bs=1   048576
1024+0 records in
1024+0 records out
1073741824 bytes (1.1 GB) copied, 9.4847 s, 113 MB/s

real    0m9.490s
user    0m0.000s
sys     0m0.992s
```

Măsurare timp – Din program

```
clock_t t;
t = clock();
WORK();
t = clock() - t;
double time_taken = ((double)t)/CLOCKS_PER_SEC; // in seconds
```

Măsurare timp – Din program

DO NOT USE

```
clock_t t;
t = clock();
WORK();
t = clock() - t;
double time_taken = ((double)t)/CLOCKS_PER_SEC; // in seconds
```

Măsurare timp – Din program

DO NOT USE

```
clock_t t;
t = clock();
WORK();
t = clock() - t;
double time_taken = ((double)t)/CLOCKS_PER_SEC; // in seconds
```

From man: the value returned by **clock**() also includes the times of any children.

Măsurare timp – Din program

```
struct timespec start, finish;
double elapsed;
clock_gettime(CLOCK_MONOTONIC, &start);
WORK();
clock_gettime(CLOCK_MONOTONIC, &finish);
elapsed = (finish.tv_sec - start.tv_sec);
elapsed += (finish.tv_nsec - start.tv_nsec) / 1000000000.0;
```

Măsurare timp cu sau fără I/O?

Performanța

- Timp de execuție
- Memorie ocupată
- Număr de procese (thread-uri)
- Scalabilitate
- Toleranță la defecte
- Cost

Măsuri

- T - Timpul total necesar execuției programului paralel
- P - Numărul de procesoare utilizate
- S – Speedup
  - $S = \frac{G}{T}$
- G – Timp execuție cel mai rapid algoritm secvențial

- Costul C = T * P

- Eficienţa $E = \frac{G}{C} = \frac{G}{TP} = \frac{S}{P}$

Complexitate

* 3

Complexitate secvențială?

Complexitate

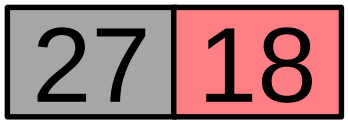
* 3

27

Complexitate secvențială?

Complexitate

* 3



Complexitate secvențială?

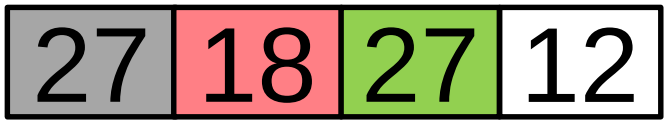
Complexitate

* 3

Complexitate secvențială?

Complexitate

* 3



Complexitate secvențială?

Complexitate

* 3

Complexitate secvențială? O(**N**)

Complexitate

* 3

Complexitate paralelă?

Complexitate

* 3

Complexitate paralelă? **O(1)** ?

Complexitate

* 3

Complexitate paralelă? **O(1)** ? **P** = **N**

Complexitate

* 3

Complexitate paralelă? $\mathbf{O}(\frac{N}{P})$

Complexitate

Speedup?

Complexitate

Speedup?

$T = O(\frac{N}{P})$

Complexitate

Speedup?

T = O($\frac{N}{P}$)

G = O(N)

Complexitate

Speedup?

T = O($\frac{N}{P}$)

G = O(N)

$$S = \frac{O(N)}{O(\frac{N}{P})}$$

Complexitate

Speedup?

T = O($\frac{N}{P}$)

G = O(N)

$$S = \frac{O(N)}{O(\frac{N}{P})} = O(P)$$

Complexitate

$$S = \frac{O(N)}{O(\frac{N}{P})} = O(P)$$

Eficiența?

T = O($\frac{N}{P}$)

G = O(N)

Complexitate

$$S = \frac{O(N)}{O(\frac{N}{P})} = O(P)$$

Eficiența?

$$E = \frac{S}{P} = \frac{O(P)}{P} = 1$$

T = O($\frac{N}{P}$)

G = O(N)

Timpi adunare a doi vectori C = A + B

Sequential	Pthread (1 Thread)	Pthread(2 Thread)	Pthread(4 Thread)
real 0m6.151s user 0m6.141s sys 0m0.000s	real 0m7.777s user 0m7.766s sys 0m0.000s	real 0m3.954s user 0m7.828s sys 0m0.000s	real 0m2.011s user 0m7.875s sys 0m0.031s

Timpi adunare a doi vectori C = A + B

Sequential	Pthread (1 Thread)	Pthread(2 Thread)	Pthread(4 Thread)
real 0m6.151s user 0m6.141s sys 0m0.000s	real 0m7.777s user 0m7.766s sys 0m0.000s	real 0m3.954s user 0m7.828s sys 0m0.000s	real 0m2.011s user 0m7.875s sys 0m0.031s
S = 1			

$$S = \frac{6.14}{6.14}$$

Timpi adunare a doi vectori C = A + B

Sequential	Pthread (1 Thread)	Pthread(2 Thread)	Pthread(4 Thread)
real 0m6.151s user 0m6.141s sys 0m0.000s	real 0m7.777s user 0m7.766s sys 0m0.000s	real 0m3.954s user 0m7.828s sys 0m0.000s	real 0m2.011s user 0m7.875s sys 0m0.031s
S = 1	S = 0.8		

$$S = \frac{6.14}{7.76}$$

Timpi adunare a doi vectori C = A + B

Sequential	Pthread (1 Thread)	Pthread(2 Thread)	Pthread(4 Thread)
real 0m6.151s user 0m6.141s sys 0m0.000s	real 0m7.777s user 0m7.766s sys 0m0.000s	real 0m3.954s user 0m7.828s sys 0m0.000s	real 0m2.011s user 0m7.875s sys 0m0.031s
S = 1	S = 0.8	S = 0.78	

$$S = \frac{6.14}{7.78}$$

Timpi adunare a doi vectori C = A + B

Sequential	Pthread (1 Thread)	Pthread(2 Thread)	Pthread(4 Thread)
real 0m6.151s user 0m6.141s sys 0m0.000s	real 0m7.777s user 0m7.766s sys 0m0.000s	real 0m3.954s user 0m7.828s sys 0m0.000s	real 0m2.011s user 0m7.875s sys 0m0.031s
S = 1	S = 0.8	S = 0.78	S = 0.78

$$S = \frac{6.14}{7.78}$$

Timpi adunare a doi vectori C = A + B

Sequential	Pthread (1 Thread)	Pthread(2 Thread)	Pthread(4 Thread)
real 0m6.151s user 0m6.141s sys 0m0.000s	real 0m7.777s user 0m7.766s sys 0m0.000s	real 0m3.954s user 0m7.828s sys 0m0.000s	real 0m2.011s user 0m7.875s sys 0m0.031s
S = 1	S = 0.8	S = 0.78	S = 0.78

WRONG

$$S = \frac{6.14}{7.78}$$

Timpi adunare a doi vectori C = A + B

Sequential	Pthread (1 Thread)	Pthread(2 Thread)	Pthread(4 Thread)
real 0m6.151s user 0m6.141s sys 0m0.000s	real 0m7.777s user 0m7.766s sys 0m0.000s	real 0m3.954s user 0m7.828s sys 0m0.000s	real 0m2.011s user 0m7.875s sys 0m0.031s
S = 1			

$$S = \frac{6.15}{6.15}$$

Timpi adunare a doi vectori C = A + B

Sequential	Pthread (1 Thread)	Pthread(2 Thread)	Pthread(4 Thread)
real 0m6.151s user 0m6.141s sys 0m0.000s	real 0m7.777s user 0m7.766s sys 0m0.000s	real 0m3.954s user 0m7.828s sys 0m0.000s	real 0m2.011s user 0m7.875s sys 0m0.031s
S = 1	S = 0.8		

$$S = \frac{6.15}{7.77}$$

Timpi adunare a doi vectori C = A + B

Sequential	Pthread (1 Thread)	Pthread(2 Thread)	Pthread(4 Thread)
real 0m6.151s user 0m6.141s sys 0m0.000s	real 0m7.777s user 0m7.766s sys 0m0.000s	real 0m3.954s user 0m7.828s sys 0m0.000s	real 0m2.011s user 0m7.875s sys 0m0.031s
S = 1	S = 0.8	S = 1.55	

$$S = \frac{6.15}{3.95}$$

Timpi adunare a doi vectori C = A + B

Sequential	Pthread (1 Thread)	Pthread(2 Thread)	Pthread(4 Thread)
real 0m6.151s user 0m6.141s sys 0m0.000s	real 0m7.777s user 0m7.766s sys 0m0.000s	real 0m3.954s user 0m7.828s sys 0m0.000s	real 0m2.011s user 0m7.875s sys 0m0.031s
S = 1	S = 0.8	S = 1.55	S = 3.05

$$S = \frac{6.15}{2.01}$$

Timpi adunare a doi vectori C = A + B

Sequential	Pthread (1 Thread)	Pthread(2 Thread)	Pthread(4 Thread)
real 0m6.151s user 0m6.141s sys 0m0.000s	real 0m7.777s user 0m7.766s sys 0m0.000s	real 0m3.954s user 0m7.828s sys 0m0.000s	real 0m2.011s user 0m7.875s sys 0m0.031s
S = 1	S = 0.8	S = 1.55	S = 3.05

De ce nu **S = P** ?

Timpi adunare a doi vectori C = A + B

Nu se ține cont de timpul de citire/scriere RAM.

Sequential	Pthread (1 Thread)	Pthread(2 Thread)	Pthread(4 Thread)
real 0m6.151s user 0m6.141s sys 0m0.000s	real 0m7.777s user 0m7.766s sys 0m0.000s	real 0m3.954s user 0m7.828s sys 0m0.000s	real 0m2.011s user 0m7.875s sys 0m0.031s
S = 1	S = 0.8	S = 1.55	S = 3.05

De ce nu **S = P** ? S = O(P) este **ideal**.

Timpi adunare a doi vectori C = A + B

$$E = \frac{1}{1}$$

Sequential	Pthread (1 Thread)	Pthread(2 Thread)	Pthread(4 Thread)
real 0m6.151s user 0m6.141s sys 0m0.000s	real 0m7.777s user 0m7.766s sys 0m0.000s	real 0m3.954s user 0m7.828s sys 0m0.000s	real 0m2.011s user 0m7.875s sys 0m0.031s
S = 1	S = 0.8	S = 1.55	S = 3.05
E = 1			

Timpi adunare a doi vectori C = A + B

$$E = \frac{0.8}{1}$$

Sequential	Pthread (1 Thread)	Pthread(2 Thread)	Pthread(4 Thread)
real 0m6.151s user 0m6.141s sys 0m0.000s	real 0m7.777s user 0m7.766s sys 0m0.000s	real 0m3.954s user 0m7.828s sys 0m0.000s	real 0m2.011s user 0m7.875s sys 0m0.031s
S = 1	S = 0.8	S = 1.55	S = 3.05
E = 1	E = 0.8		

Timpi adunare a doi vectori C = A + B

$$E = \frac{1.55}{2}$$

Sequential	Pthread (1 Thread)	Pthread(2 Thread)	Pthread(4 Thread)
real 0m6.151s user 0m6.141s sys 0m0.000s	real 0m7.777s user 0m7.766s sys 0m0.000s	real 0m3.954s user 0m7.828s sys 0m0.000s	real 0m2.011s user 0m7.875s sys 0m0.031s
S = 1	S = 0.8	S = 1.55	S = 3.05
E = 1	E = 0.8	E = 0.77	

Timpi adunare a doi vectori C = A + B

$$E = \frac{3.05}{4}$$

Sequential	Pthread (1 Thread)	Pthread(2 Thread)	Pthread(4 Thread)
real 0m6.151s user 0m6.141s sys 0m0.000s	real 0m7.777s user 0m7.766s sys 0m0.000s	real 0m3.954s user 0m7.828s sys 0m0.000s	real 0m2.011s user 0m7.875s sys 0m0.031s
S = 1	S = 0.8	S = 1.55	S = 3.05
E = 1	E = 0.8	E = 0.77	E = 0.76

Amdahl's law

Validity of the single processor approach to achieving large scale computing capabilities[1]

Gene M. Amdahl

IBM Sunnyvale, California

1 INTRODUCTION

For over a decade prophets have voiced the contention that the o
has reached its limits and that truly significant advences can be m
multiplicity of computers in such a manner as to permit cooperati
direction has been pointed out as general purpose computers wi
of memories, or as specialized computers with geometrically relat
controlled by one or more instruction streams.

Amdahl's law - prerequisits

f - Procent de operații din algoritmul secvențial care se pot executa paralel.

$$T = fG + (1 - f)\frac{G}{P}$$

$$S = \frac{G}{T}$$

Amdahl's law - prerequisits

f - Procent de operații din algoritmul secvențial care se pot executa paralel.

$$T = fG + (1 - f)\frac{G}{P}$$

$$S = \frac{G}{T} = \frac{G}{fG + \frac{(1-f)G}{P}}$$

Amdahl's law

$$S = \frac{1}{f + \frac{(1-f)}{P}}$$

Amdahl's law

$$S = \frac{1}{f + \frac{(1-f)}{P}}$$

Ce se întâmplă dacă P e foarte mare (chiar mai mare decât N)?

Amdahl's law

$$S = \frac{1}{f + \frac{(1-f)}{P}}$$

Ce se întâmplă dacă P e foarte mare (chiar mai mare decât N)?

$$\boldsymbol{S \leq \frac{1}{f}}$$

Amdahl's law - prerequisits

f - Procent de operații din algoritmul secvențial care se pot executa paralel.

$$T = fG + (1 - f)\frac{G}{P}$$

Ce se întâmplă dacă P e foarte mare (chiar mai mare decât N)?

Amdahl's law - prerequisits

f - Procent de operații din algoritmul secvențial care se pot executa paralel.

$$T = fG + (1 - f)\frac{G}{P}$$

Ce se întâmplă dacă P e foarte mare (chiar mai mare decât N)?

$$\boldsymbol{T \geq fG}$$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Pauză

```
int a = 0
co [Tid=1 to 2]
{
        for(int i = 0; i < 10000; i++)
                a = a + 2
}

print(a)
```

Care este valoarea minimă ce poate fi printată?


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Amdahl's law

Secvență Secvențială

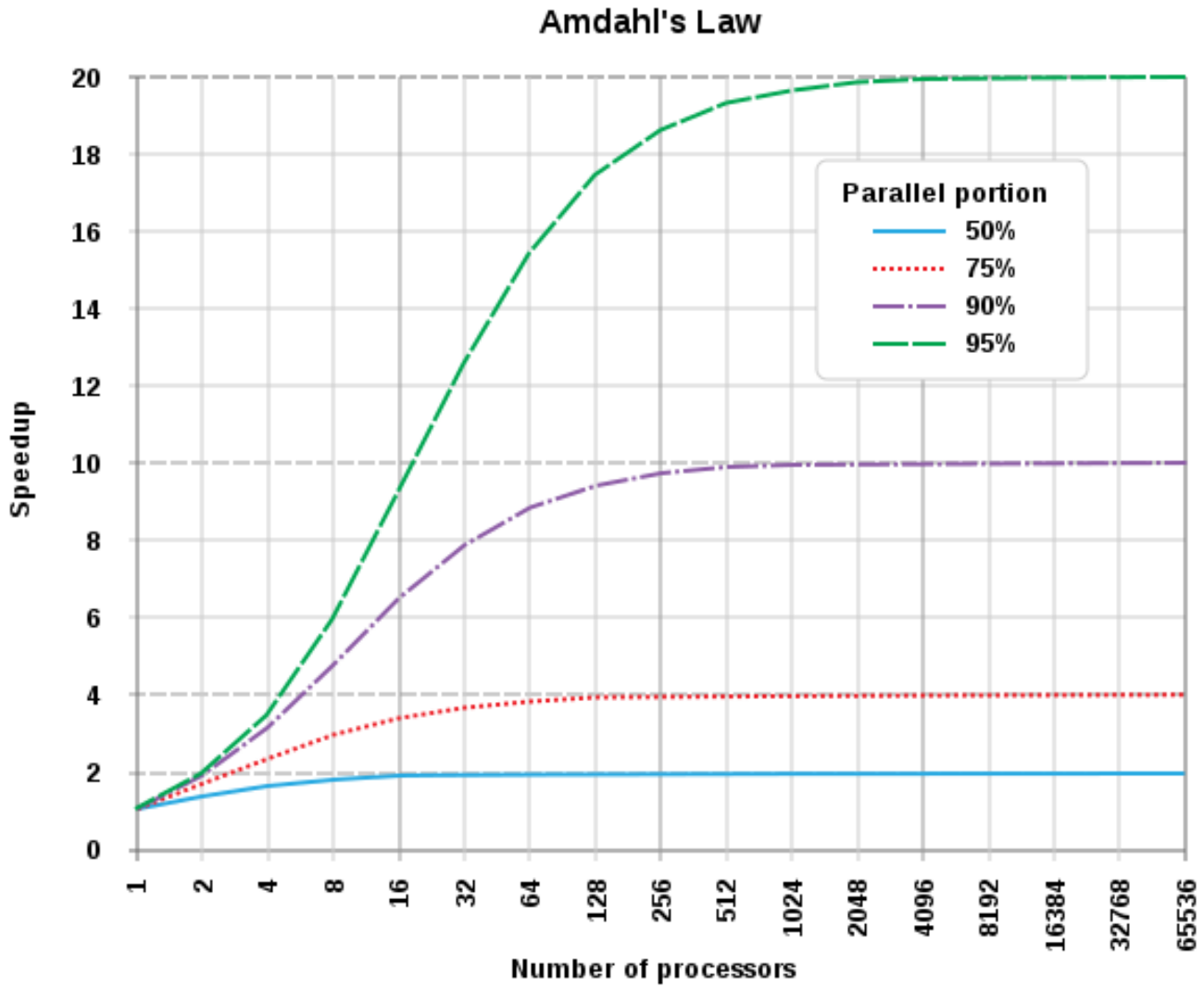
Secvență Paralelizabilă

Secvență Secvențială

Secvență Paralelizată

Măsurare timp cu sau fără I/O?

Amdahl's law


Amdahl's Law
Speedup
Number of processors
Parallel portion
50%
75%
90%
95%
0
2
4
6
8
10
12
14
16
18
20
1
2
4
8
16
32
64
128
256
512
1024
2048
4096
8192
16384
32768
65536

Amdahl's law

$$S = \frac{1}{f + \frac{(1-f)}{P}}$$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Reminder

- Ce este un semafor?

- Ce este un mutex?

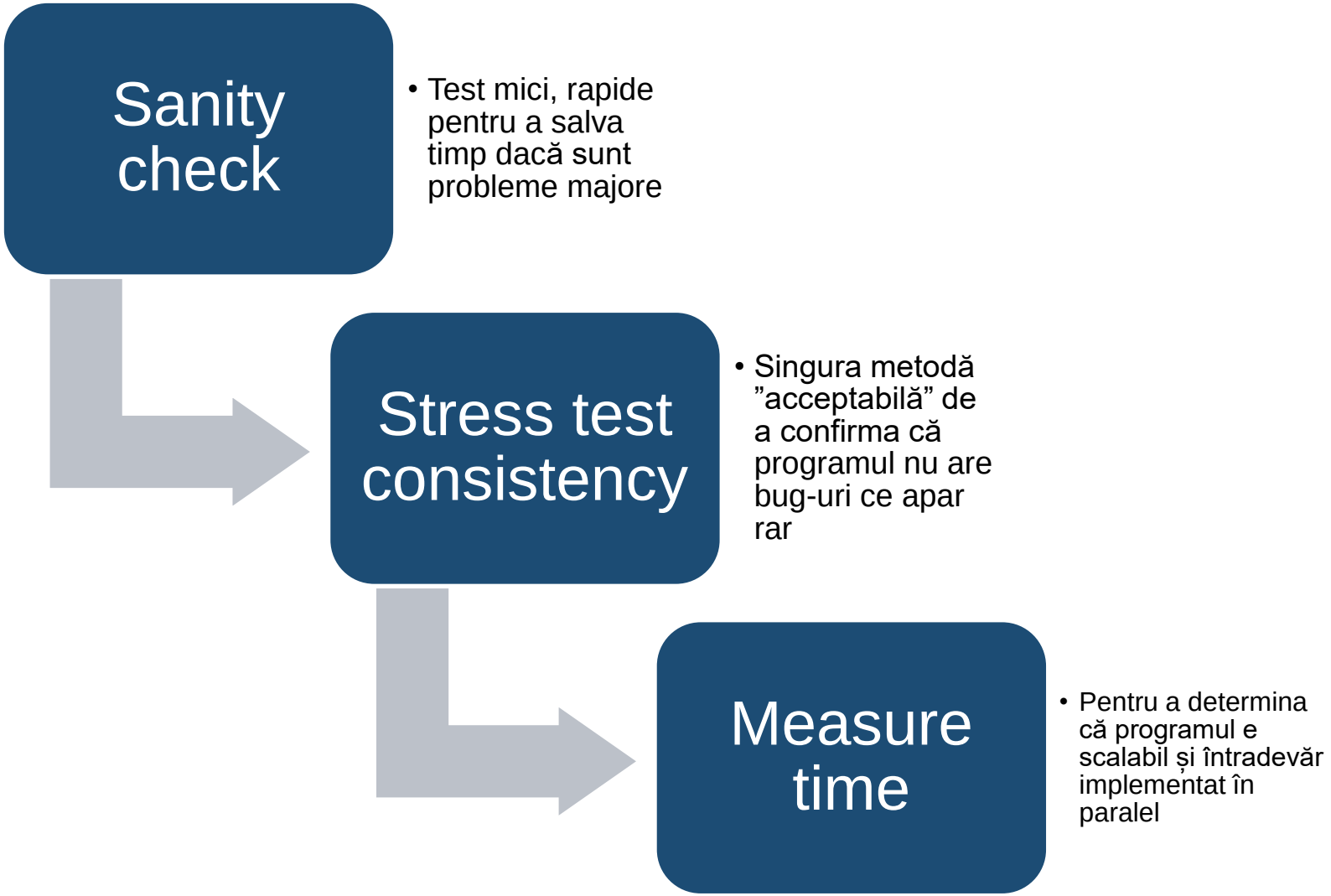
- Ce este o barieră?

Consistența?

- Demonstrație formală

- Stres test
  - mereu comparați cu rezultatul algoritmului secvențial sau care sunteți siguri că oferă rezultat corect

Workflow - Testarea programelor

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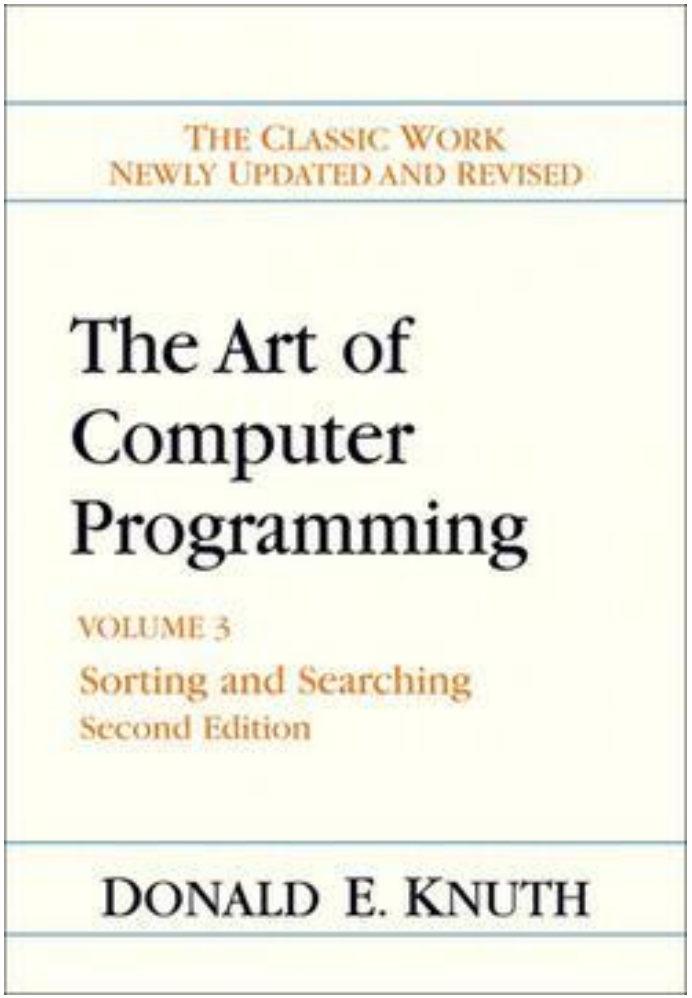
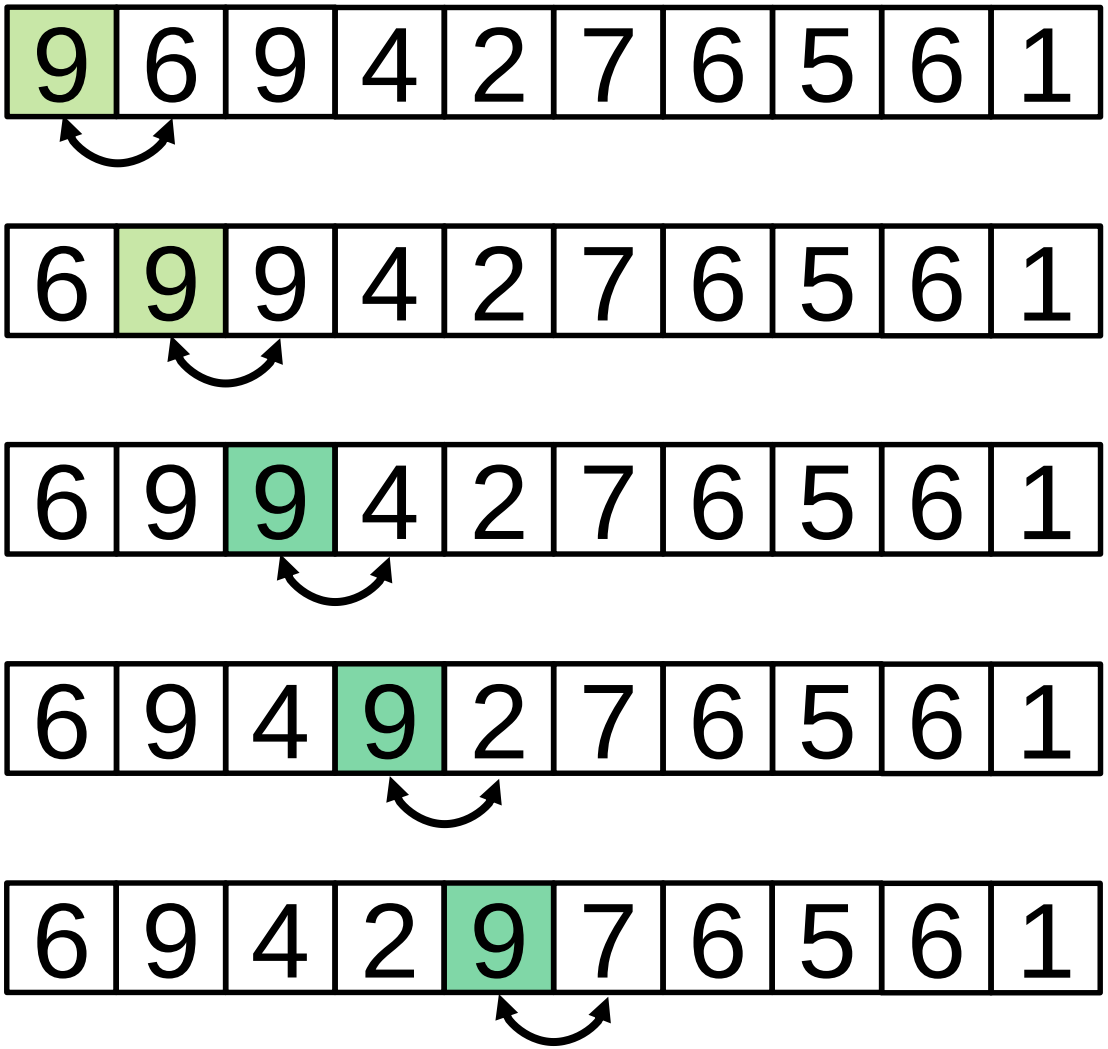
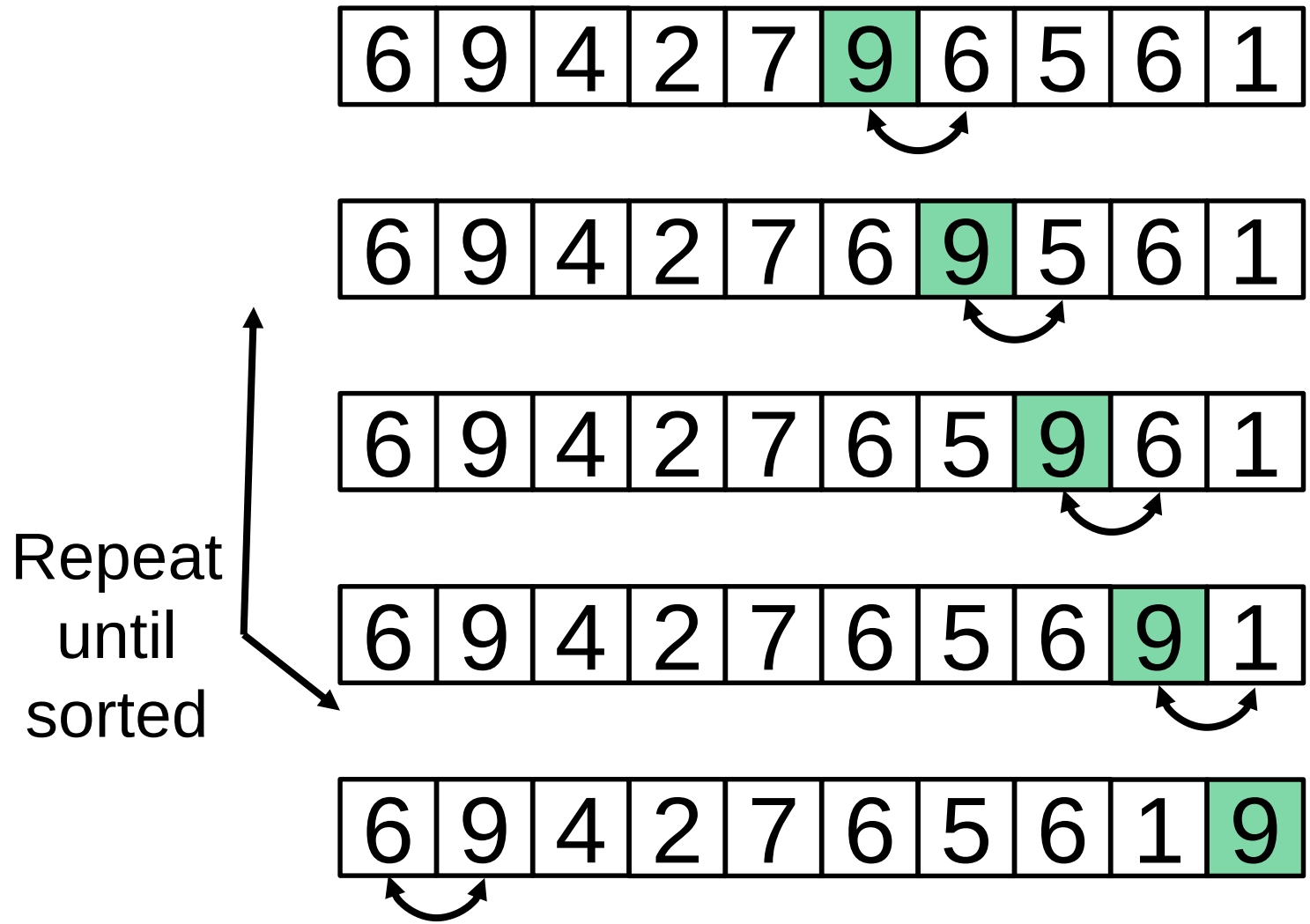
Let’s parallelize some algorithms



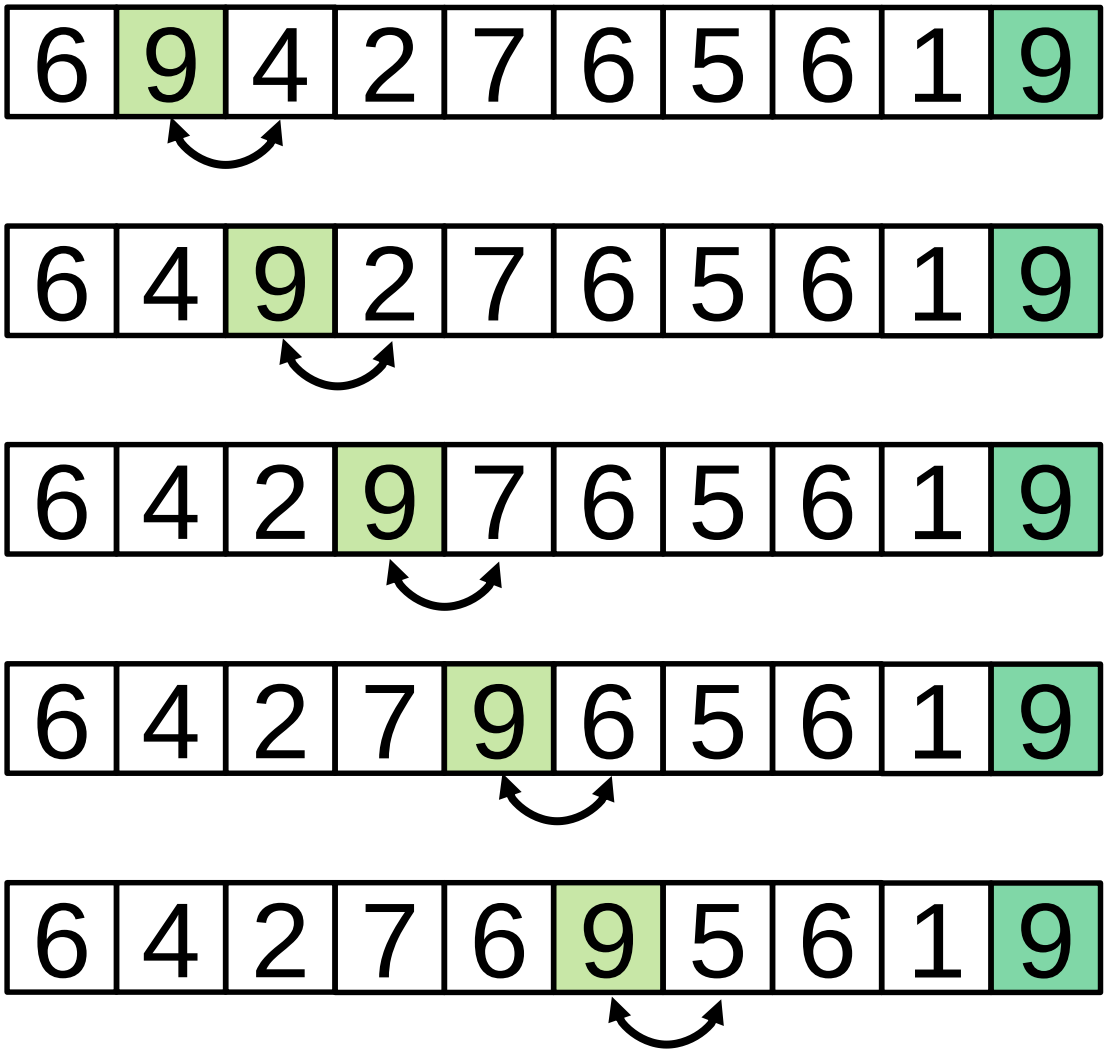
Bubble sort


9 6 9 4 2 7 6 5 6 1
6 9 9 4 2 7 6 5 6 1
6 9 9 4 2 7 6 5 6 1
6 9 4 9 2 7 6 5 6 1
6 9 4 2 9 7 6 5 6 1

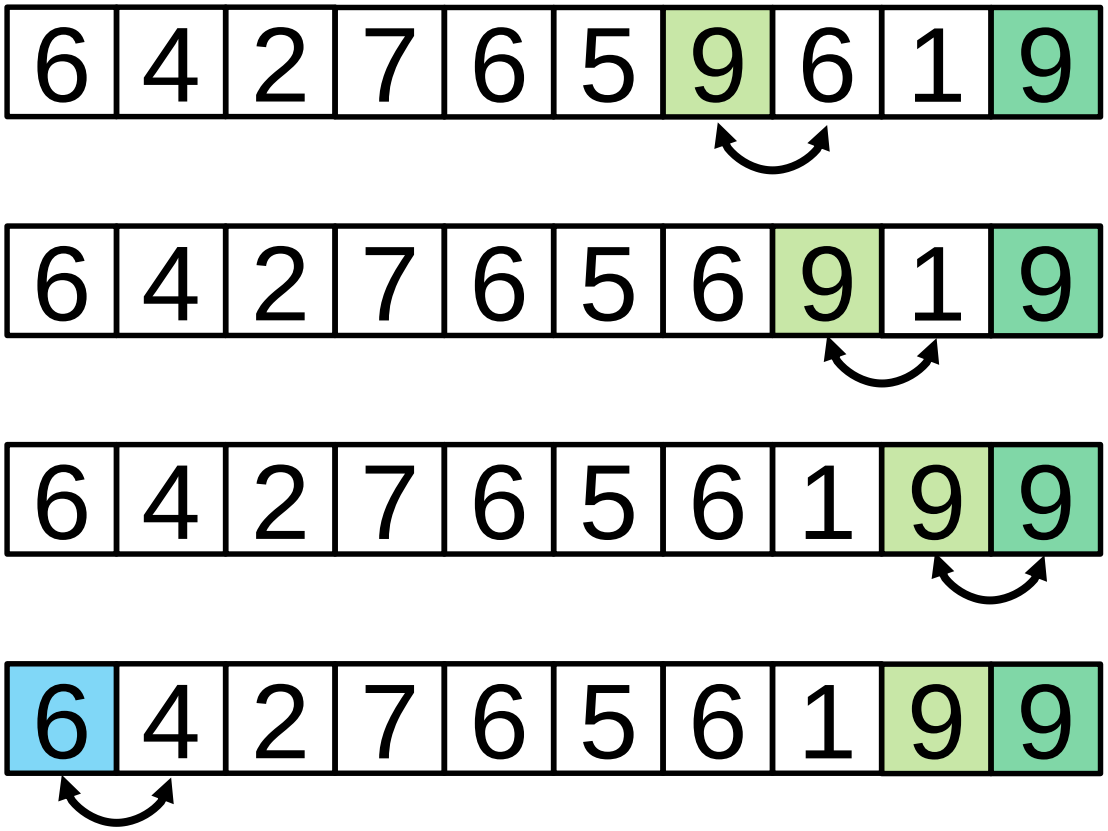
Bubble sort


6 9 4 2 7 9 6 5 6 1
6 9 4 2 7 6 9 5 6 1
6 9 4 2 7 6 5 9 6 1
6 9 4 2 7 6 5 6 9 1
6 9 4 2 7 6 5 6 1 9
Repeat until sorted

Bubble sort

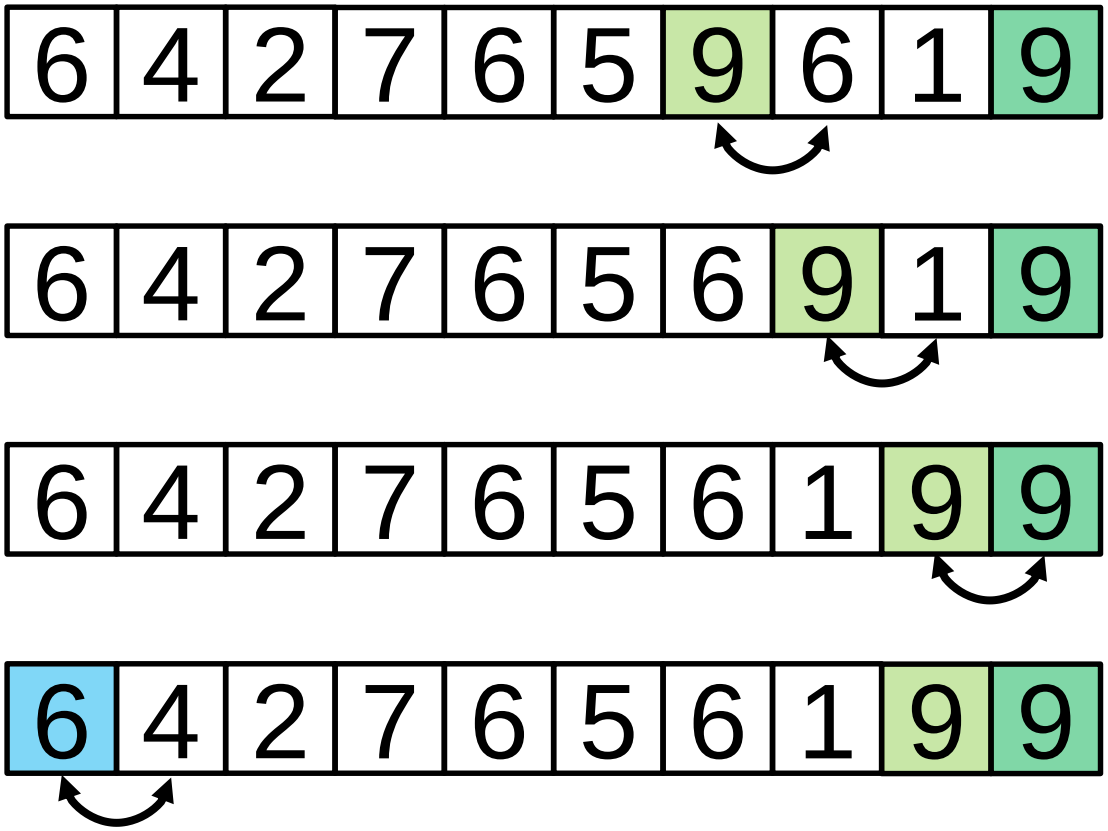

6 9 4 2 7 6 5 6 1 9
6 4 9 2 7 6 5 6 1 9
6 4 2 9 7 6 5 6 1 9
6 4 2 7 9 6 5 6 1 9
6 4 2 7 6 9 5 6 1 9

Bubble sort



.....

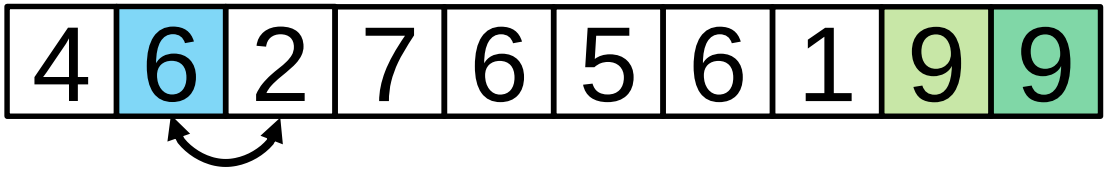
Bubble sort



.....

Complexitate?

Bubble sort

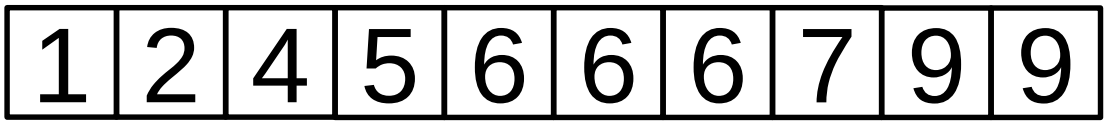


.....

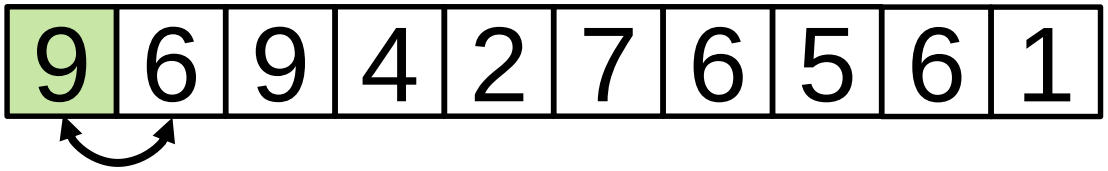
Complexitate: **O(n^2)**

Un pas trece prin toate elementele

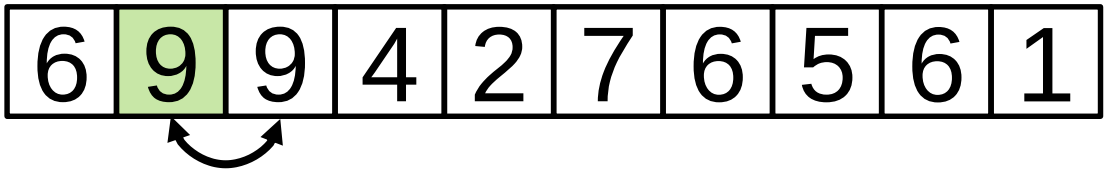
Garantat să termine după n repetiții



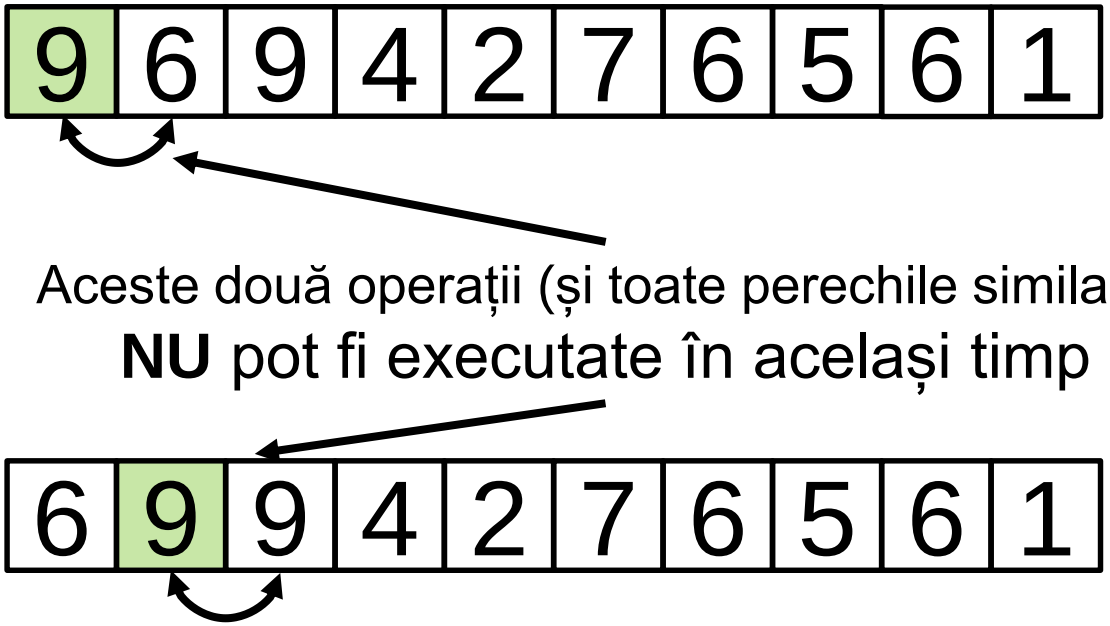
Parallel bubble sort



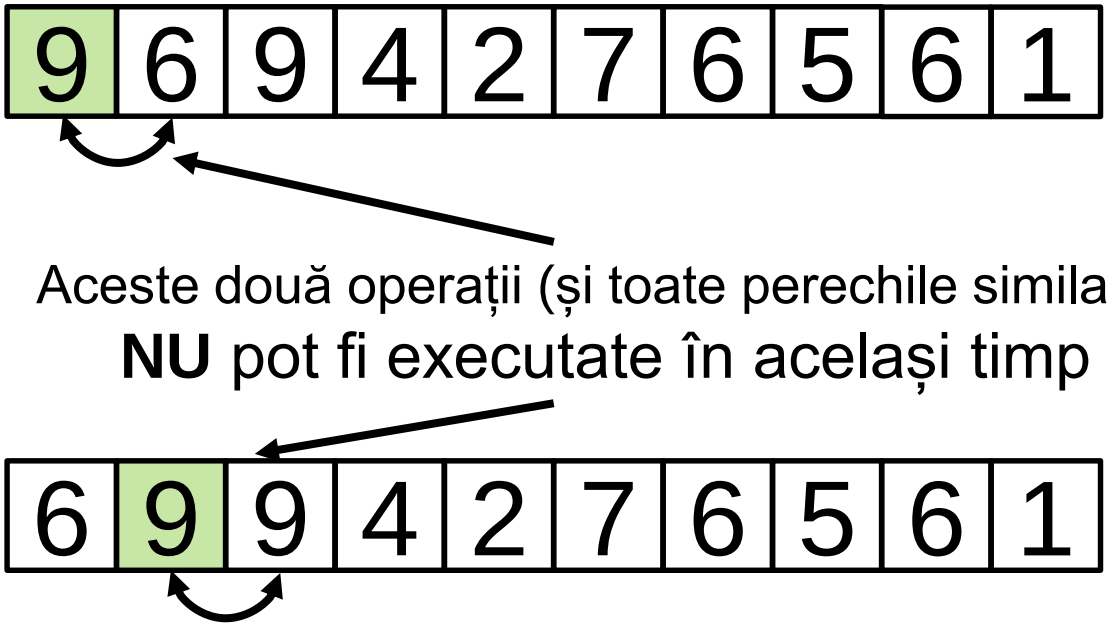
Cum paralelizăm?



Parallel bubble sort

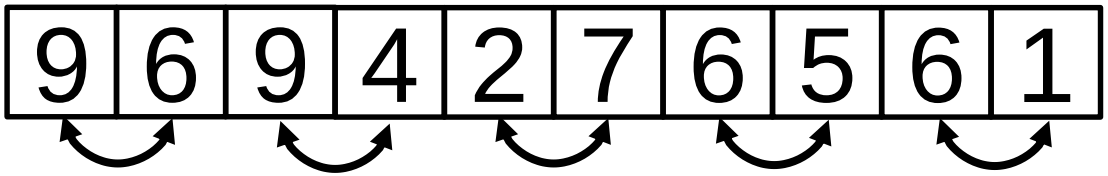


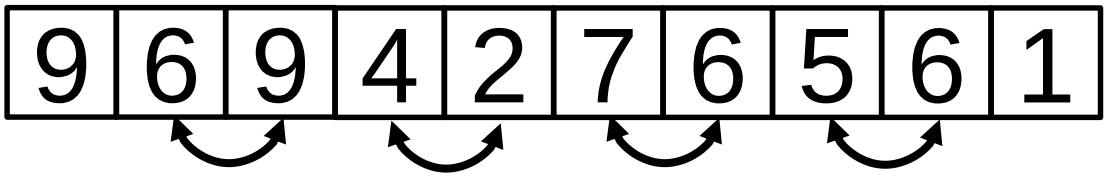
Parallel bubble sort



Solution hint: Operațiile nu trebuie executate în această ordine

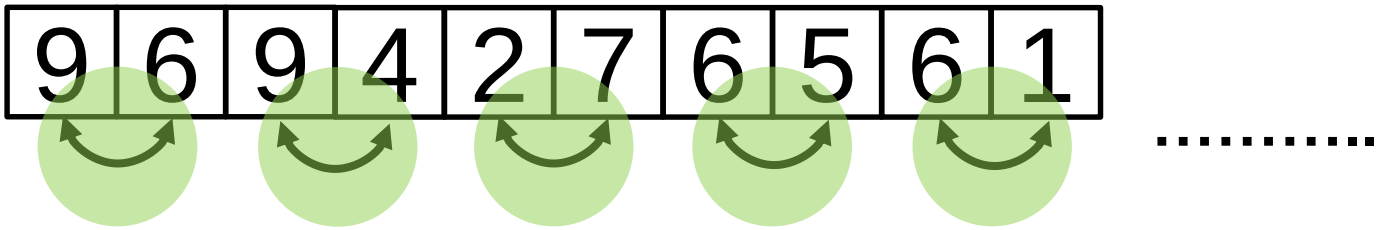
OETS: Odd-Even Transposition Sort



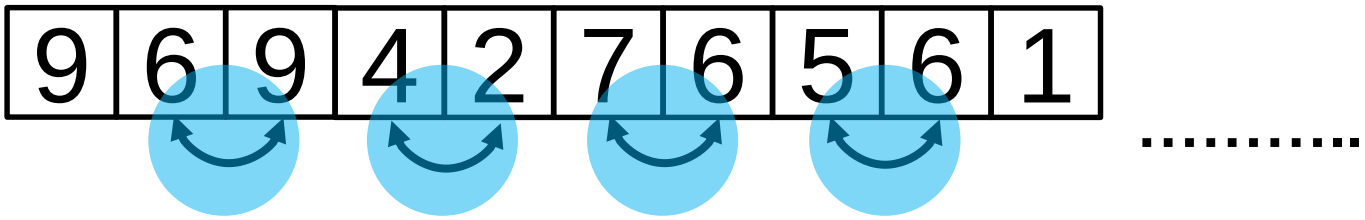


OETS: Odd-Even Transposition Sort

Pot fi executate în paralel →

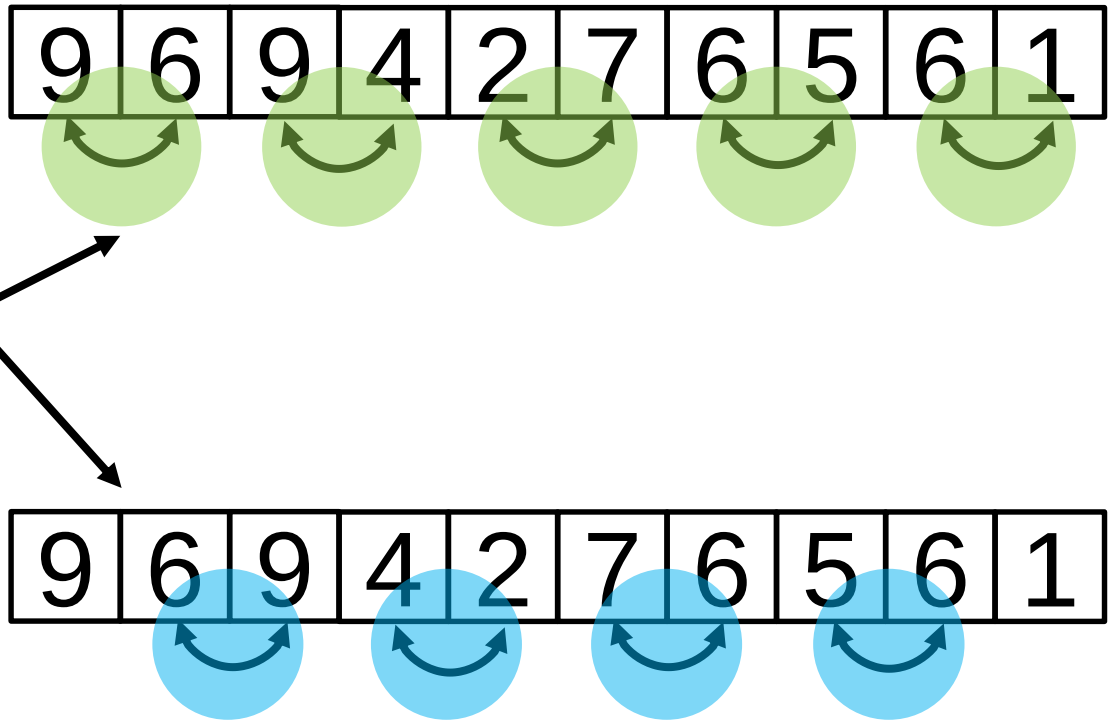


Pot fi executate în paralel →



.....

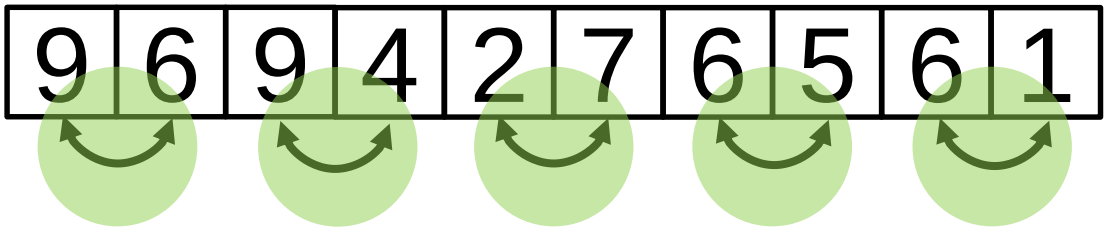
OETS: Odd-Even Transposition Sort



NU pot fi executate în paralel

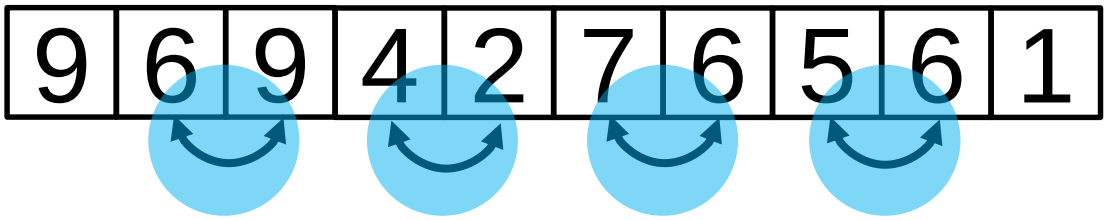
.....

OETS: Odd-Even Transposition Sort



.....

NU pot fi executate în paralel

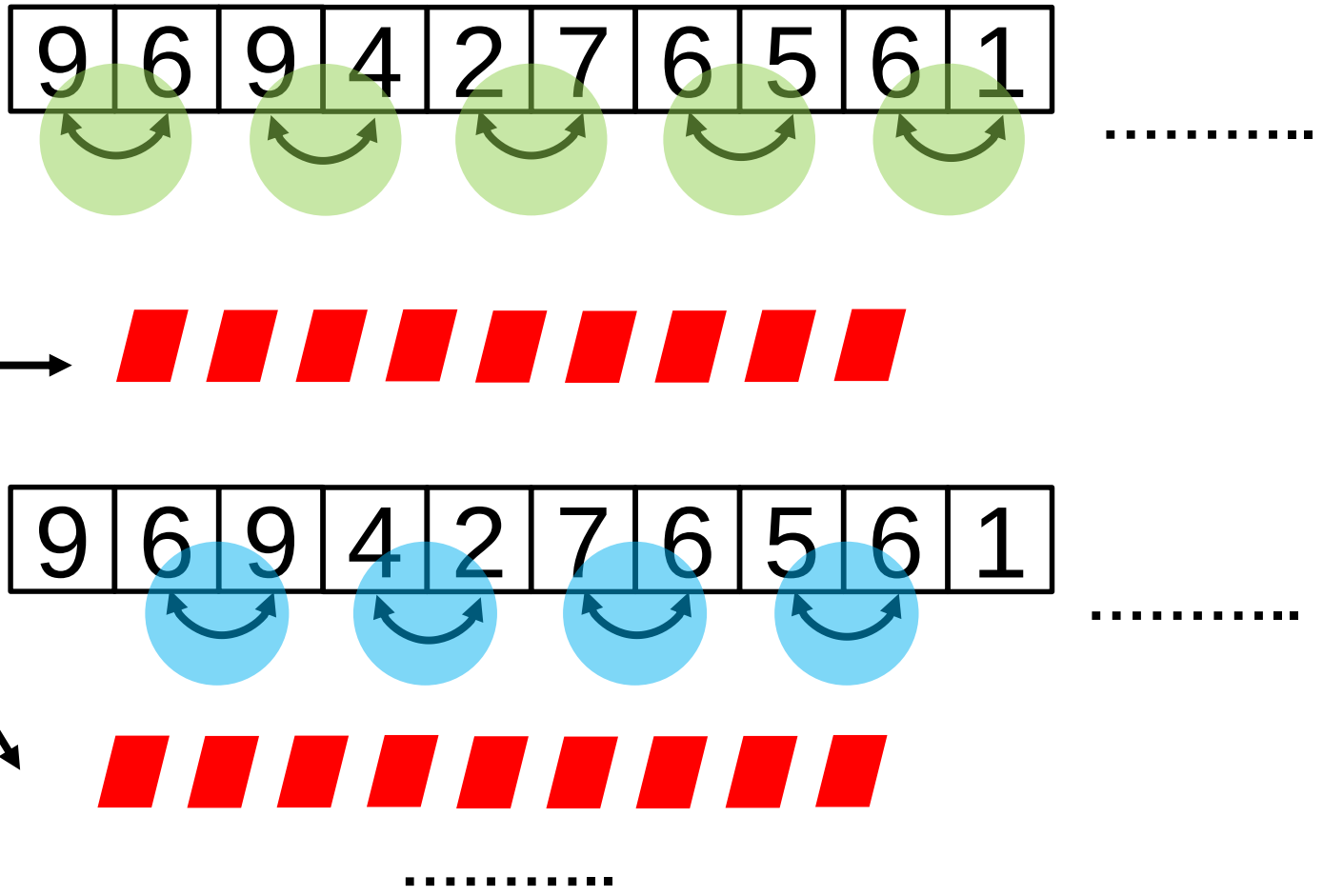


.....

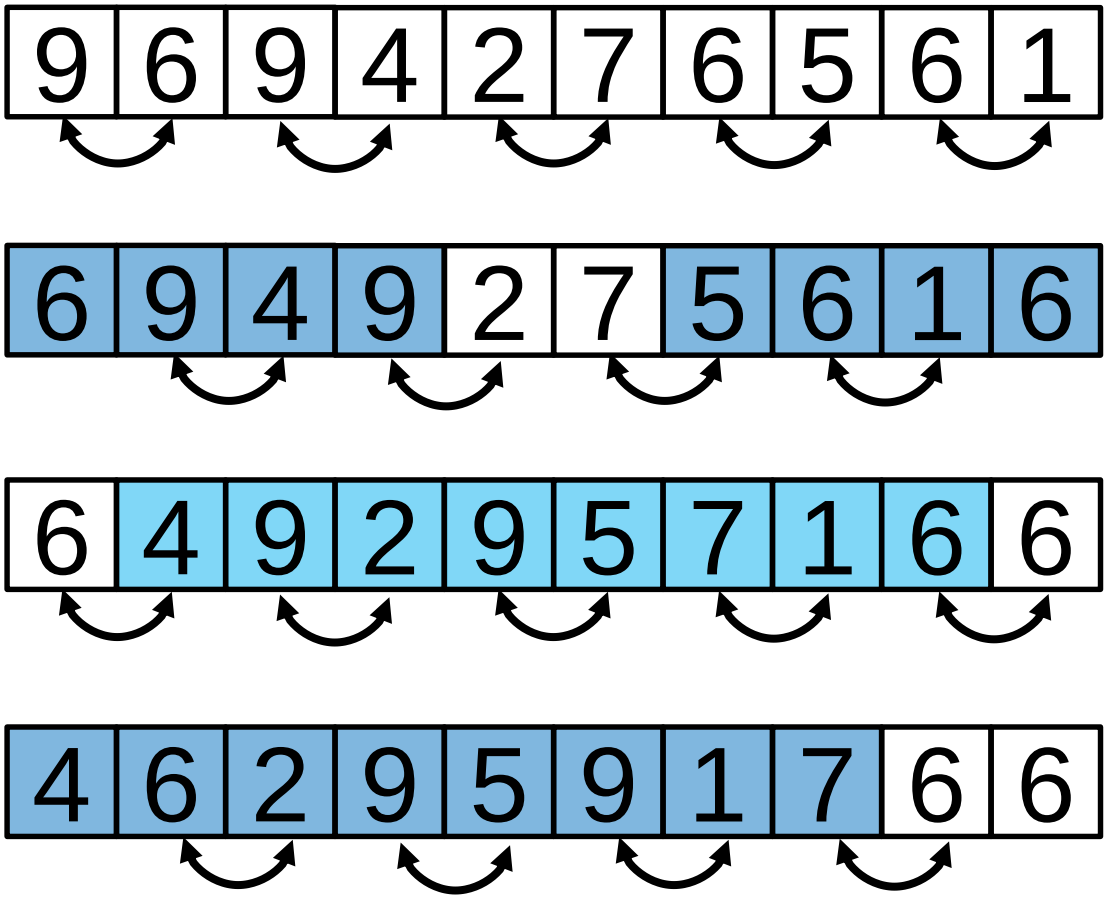
Ce facem? Ce folosim?

.....

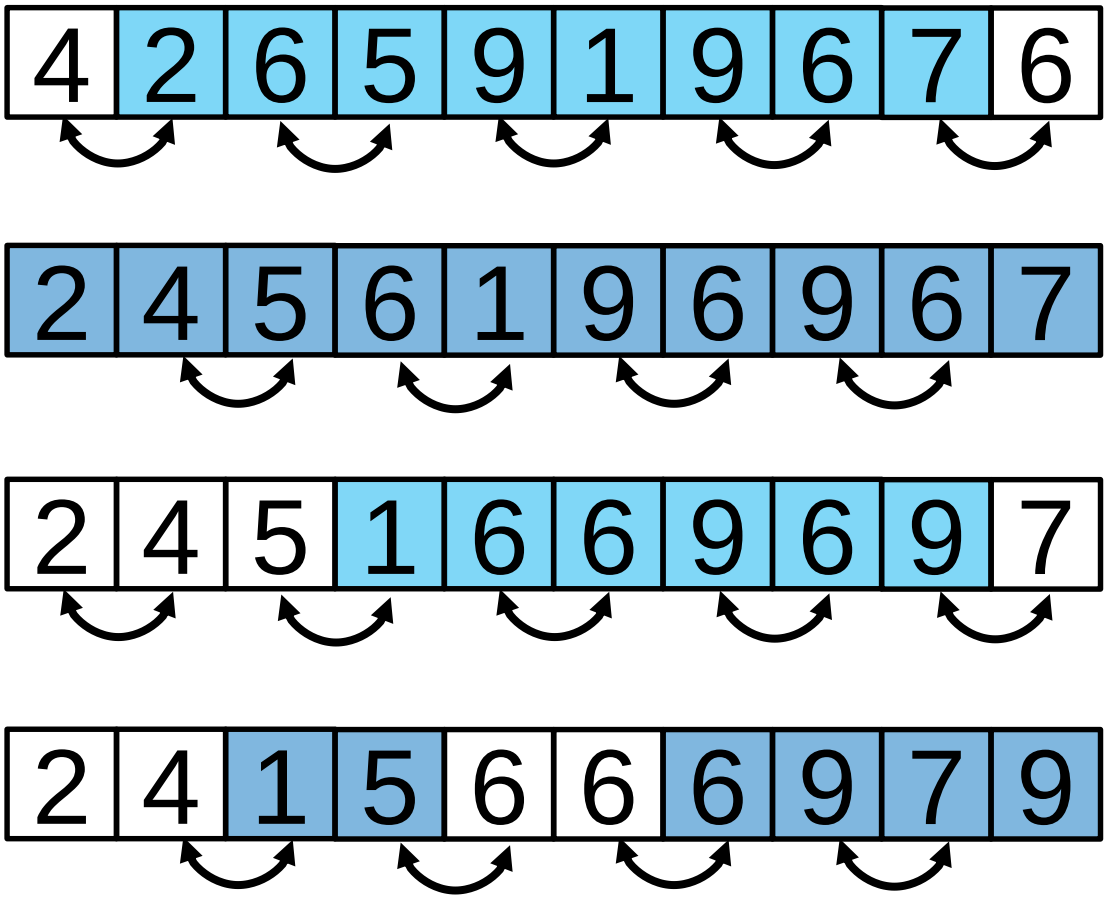
OETS: Odd-Even Transposition Sort



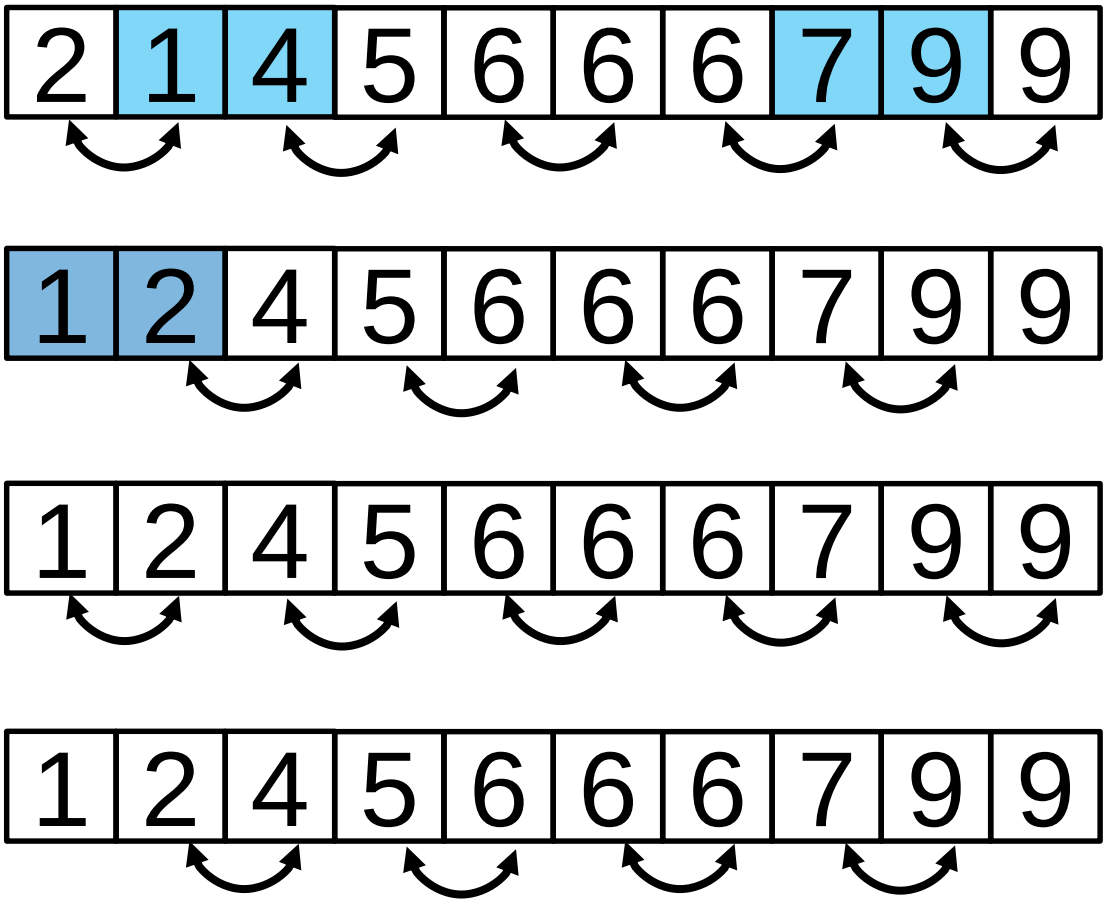
OETS: Odd-Even Transposition Sort



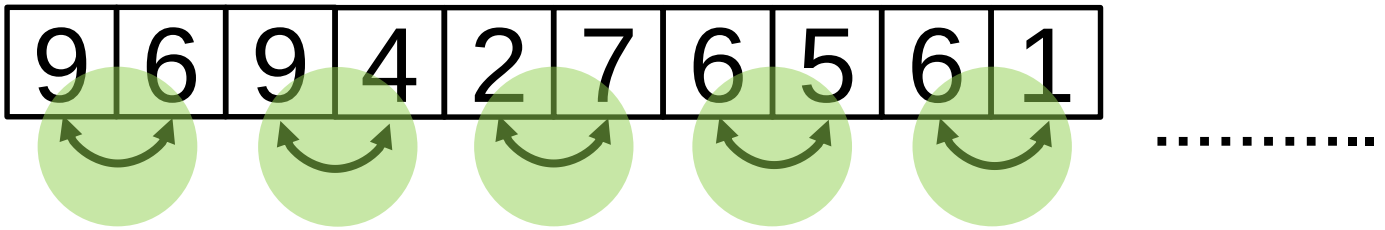
OETS: Odd-Even Transposition Sort



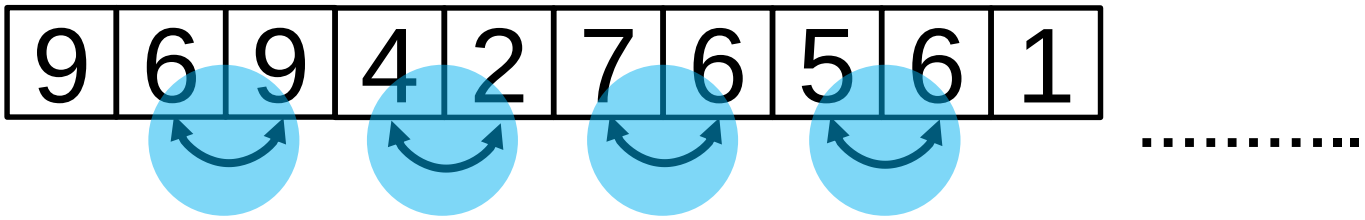
OETS: Odd-Even Transposition Sort



OETS: Odd-Even Transposition Sort

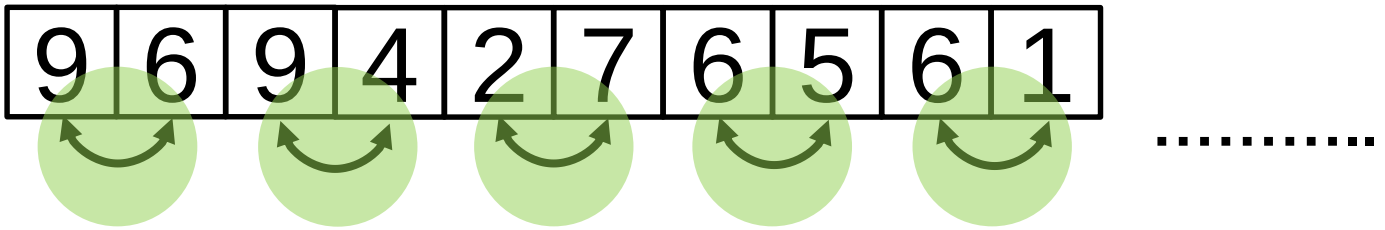


Complexitate a soluției paralele?

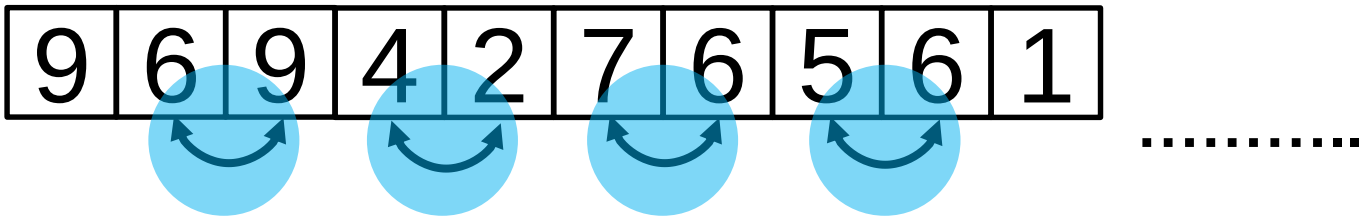


.....

OETS: Odd-Even Transposition Sort

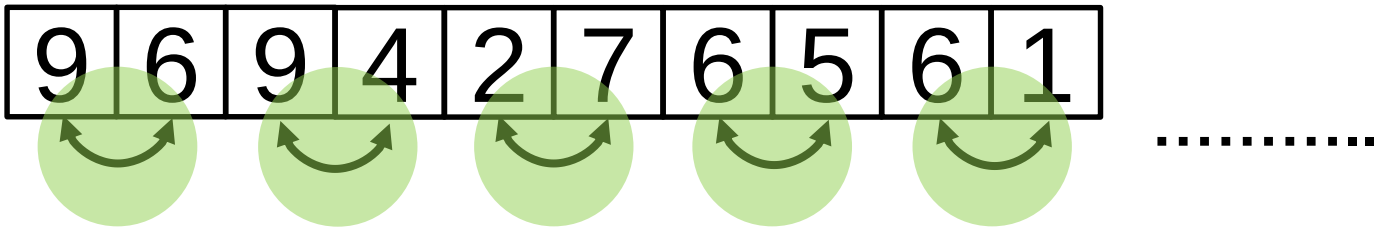


Complexitate a soluției paralele?

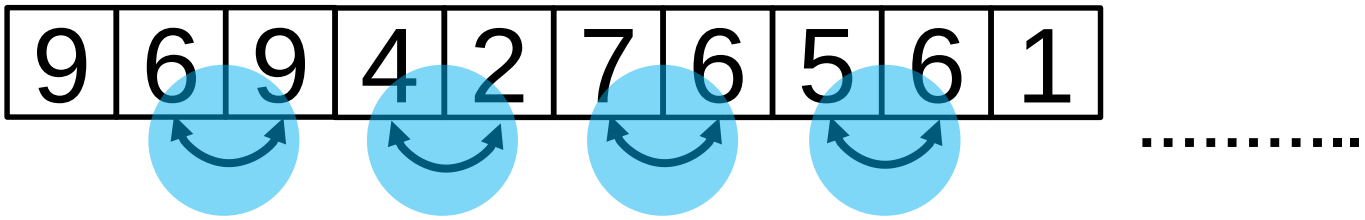


$$T = O\left(\frac{N}{P} * N\right) (= O(N) \text{ pentru } P = N)$$

OETS: Odd-Even Transposition Sort



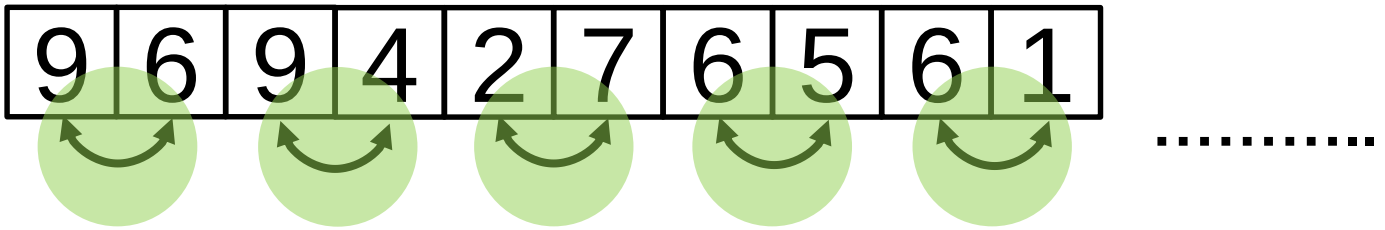
Speedup?



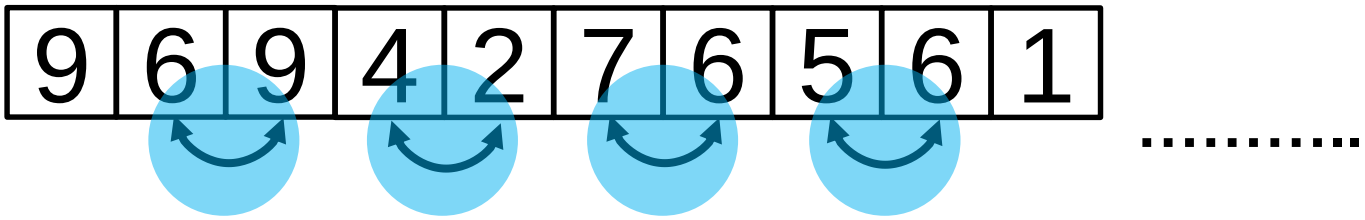
$T = O\left(\frac{N}{P} * N\right) (= O(N) \text{ pentru } P = N)$

.....

OETS: Odd-Even Transposition Sort



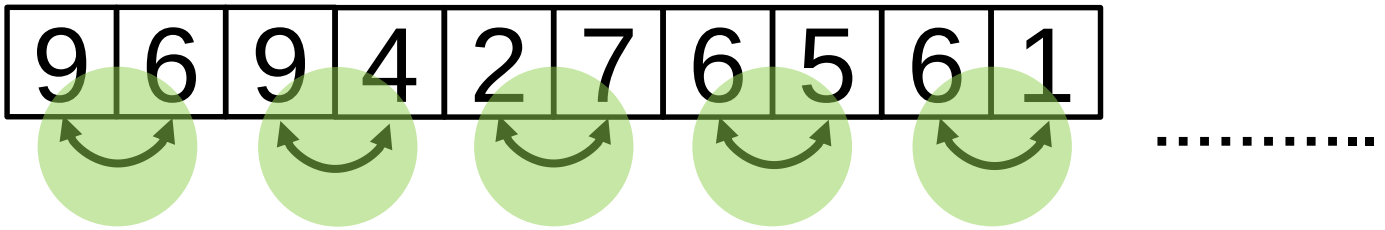
Speedup?



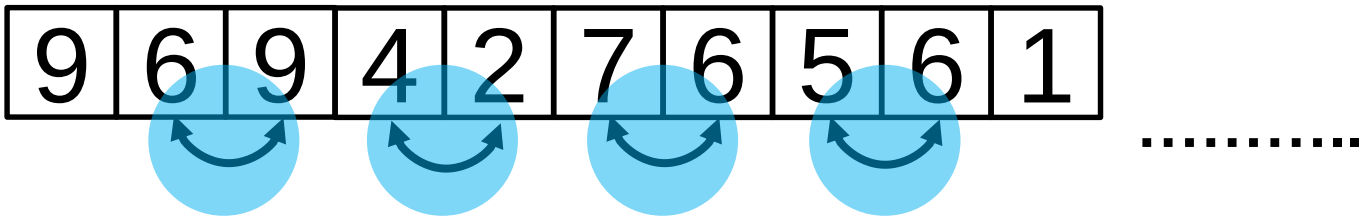
$$S = \frac{N^2}{\frac{N^2}{P}} = P$$

.....

OETS: Odd-Even Transposition Sort



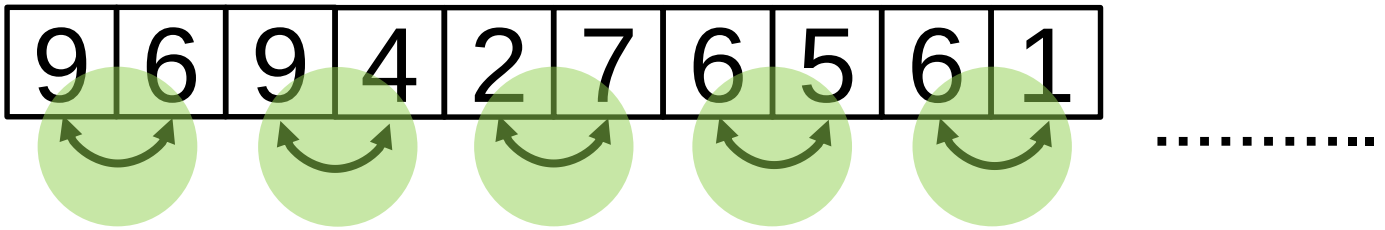
Speedup? **But is it really**?



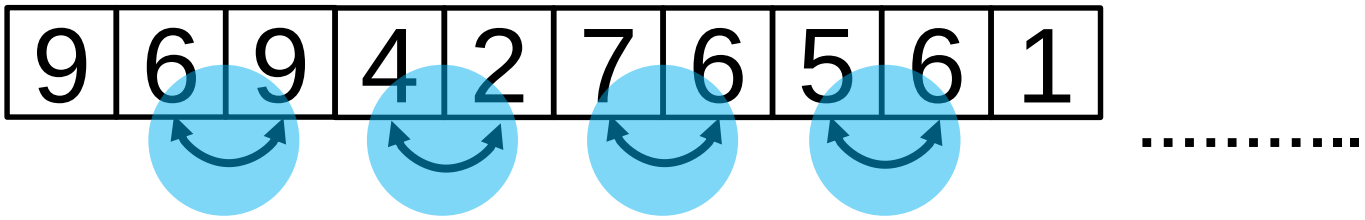
$$S = \frac{N^2}{\frac{N^2}{P}} = P$$

.....

OETS: Odd-Even Transposition Sort



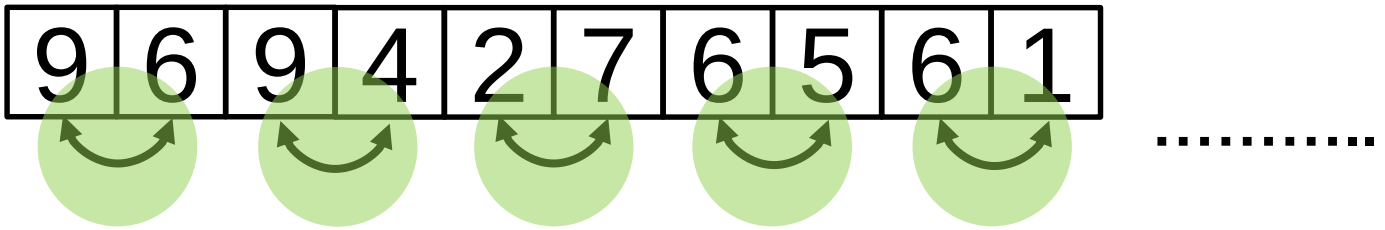
Speedup?



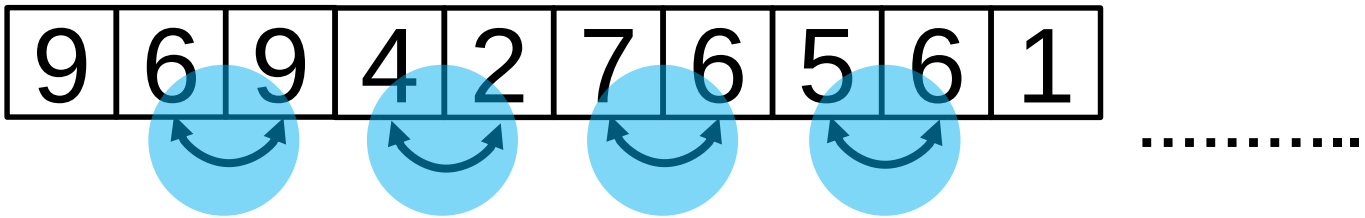
$$S = \frac{N log_2 N}{\frac{N^2}{P}}$$

.....

OETS: Odd-Even Transposition Sort

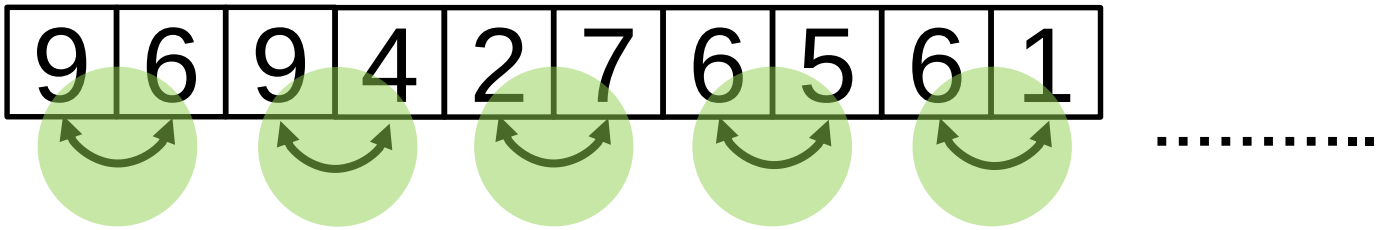


Speedup?



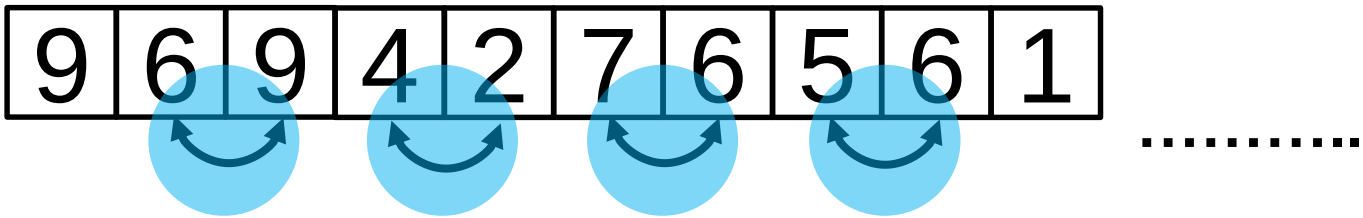
$$S = \frac{Plog_2N}{N}$$

OETS: Odd-Even Transposition Sort



.....

Nu uitați așteptatul la barieră poate introduce timpi mari!



.....

$$S = \frac{Plog_2 N}{N}$$

.....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Shear sort
(Row-column sort)
(Snake sort)

9	6	9	4	>
2	7	6	5	<
9	3	6	2	>
5	4	1	5	<

Sortează fiecare linie **pară** în mod **ascendent**
Sortează fiecare linie **impară** în mod **descendent**

Shear sort

9	6	9	4
2	7	6	5
9	3	6	2
5	4	1	5

> > > >

Sortează crescător coloanele

Shear sort

9	6	9	4	>
2	7	6	5	<
9	3	6	2	>
5	4	1	5	<
>	>	>	>	

Repetă tot de $log_2 n$ ori

Shear sort

9	6	9	4	>
2	7	6	5	<
9	3	6	2	>
5	4	1	5	<
>	>	>	>	

De ce liniile pare crescător și celelalte descrescător?

Shear sort

9	6	9	4	>
2	7	6	5	<
9	3	6	2	>
5	4	1	5	<
>	>	>	>	

De ce liniile pare crescător și celelalte descrescător?
Dorim compararea celui mai mare element de pe linia i cu cel mai mic de pe linia i+1

Shear sort

4	6	9	9	>
7	6	5	2	<
2	3	6	9	>
5	5	4	1	<

Shear sort

2	3	4	1
4	5	5	2
5	6	6	9
7	6	9	9

> > > >

Shear sort

1	2	3	4	>
5	5	4	2	<
5	6	6	9	>
9	9	7	6	<

Shear sort

1	2	3	2
5	5	4	4
5	6	6	6
9	9	7	9

> > > >

Shear sort

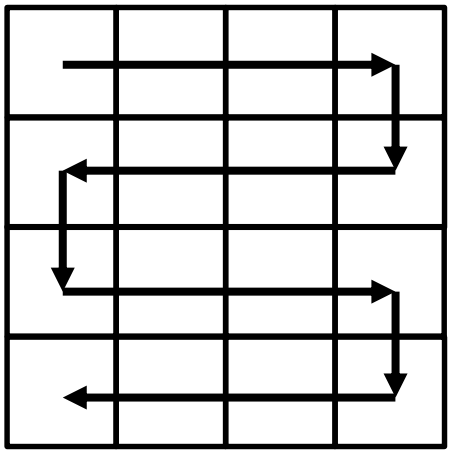
1	2	2	3	>
5	5	4	4	<
5	6	6	6	>
9	9	9	7	<

Shear sort

1	2	2	3
5	5	4	4
5	6	6	6
9	9	9	7

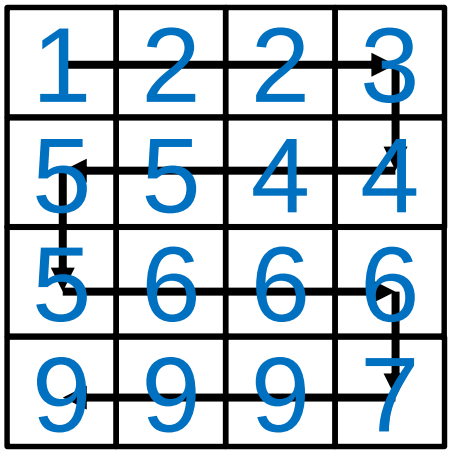
> > > >

Shear sort



Lista finală se obține citind în formă de șerpuită (snake sort)

Shear sort



1	2	2	3	4	4	5	5	5	6	6	6	7	9	9	9

Shear sort

9	6	9	4	>
2	7	6	5	<
9	3	6	2	>
5	4	1	5	<
>	>	>	>	

Complexitate? $G =$

Shear sort

9	6	9	4	>
2	7	6	5	<
9	3	6	2	>
5	4	1	5	<
>	>	>	>	

Complexitate? $G = log_2 N * log_2 N$ repetiții

Shear sort

9	6	9	4	>
2	7	6	5	<
9	3	6	2	>
5	4	1	5	<
>	>	>	>	

Complexitate? $G = log_2 N * 2 * \sqrt{N}$

$\sqrt{N}$ linii/coloane

Shear sort

9	6	9	4	>
2	7	6	5	<
9	3	6	2	>
5	4	1	5	<
>	>	>	>	

Complexitate? $G = log_2 N * 2 * \sqrt{N} * \sqrt{N} * log_2 \sqrt{N}$

$\sqrt{N} * log_2 \sqrt{N}$ cel mai bun algoritm secvențial de sortare

Shear sort

9	6	9	4	>
2	7	6	5	<
9	3	6	2	>
5	4	1	5	<
>	>	>	>	

Complexitate? $G = log_2 N * N * log_2 \sqrt{N}$

Shear sort

9	6	9	4	>
2	7	6	5	<
9	3	6	2	>
5	4	1	5	<
>	>	>	>	

Complexitate? $G = Nlog_2N * log_2\sqrt{N}$

Cel mai bun algoritm secvențial rămâne $Nlog_2N$

Shear sort

9	6	9	4	>
2	7	6	5	<
9	3	6	2	>
5	4	1	5	<
>	>	>	>	

Cum paralelizăm?

Shear sort

9	6	9	4	>
2	7	6	5	<
9	3	6	2	>
5	4	1	5	<
>	>	>	>	

Cum paralelizăm?
Toate liniile în paralel, barieră, apoi toate coloanele, apoi barieră, și repetăm.

Shear sort

9	6	9	4	>
2	7	6	5	<
9	3	6	2	>
5	4	1	5	<
>	>	>	>	

Cum paralelizăm?
Toate liniile în paralel, barieră, apoi toate coloanele, apoi barieră, și repetăm.

Shear sort

9	6	9	4	>
2	7	6	5	<
9	3	6	2	>
5	4	1	5	<
>	>	>	>	

Complexitate versiune paralelă?

$$G = log_2 N * 2 * \sqrt{N} * \sqrt{N} * log_2 \sqrt{N}$$

Shear sort

9	6	9	4	>
2	7	6	5	<
9	3	6	2	>
5	4	1	5	<
>	>	>	>	

Complexitate versiune paralelă? N = P

$$T = log_2 N * 2 * \sqrt{N} * log_2 \sqrt{N}$$

Shear sort

9	6	9	4	>
2	7	6	5	<
9	3	6	2	>
5	4	1	5	<
>	>	>	>	

Complexitate versiune paralelă? N = P

$$T = \sqrt{N}\, log_2 \sqrt{N} * log_2 N$$

Shear sort

9	6	9	4	>
2	7	6	5	<
9	3	6	2	>
5	4	1	5	<
>	>	>	>	

Complexitate versiune paralelă?

$$T = log_2 N * 2 * \frac{\sqrt{N}}{P} * \sqrt{N} * log_2 \sqrt{N}$$

Shear sort

9	6	9	4	>
2	7	6	5	<
9	3	6	2	>
5	4	1	5	<
>	>	>	>	

Complexitate versiune paralelă?

$$T = \frac{N}{P} log_2 N \ * \ log_2 \sqrt{N}$$

Shear sort

9	6	9	4	>
2	7	6	5	<
9	3	6	2	>
5	4	1	5	<
>	>	>	>	

Speedup?

$$T = \frac{N}{P} log_2 N \ * \ log_2 \sqrt{N}$$

$$G = \ N log_2 N$$

Shear sort

$$S = \frac{Nlog_2N}{\frac{N}{P}log_2N \ * \ log_2\sqrt{N}}$$

9	6	9	4	>
2	7	6	5	<
9	3	6	2	>
5	4	1	5	<
>	>	>	>	

Speedup?

$$T = \frac{N}{P}log_2N \ * \ log_2\sqrt{N}$$

$$G = \ Nlog_2N$$

Shear sort

$$S = \frac{P}{log_2\sqrt{N}}$$

9	6	9	4	>
2	7	6	5	<
9	3	6	2	>
5	4	1	5	<
>	>	>	>	

Speedup?

$$T = \frac{N}{P} log_2 N \ * \ log_2\sqrt{N}$$

$$G = \ N log_2 N$$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Matrix multiply

```
for(i=0; i<N; i++)
        for(j=0; j<N; j++)
                for(k=0; k<N; k++)
                        c[i][j] += a[i][k] * b[k][j]
```

Matrix multiply

```
for(i=0; i<N; i++)
        for(j=0; j<N; j++)
                for(k=0; k<N; k++)
                        c[i][j] += a[i][k] * b[k][j]
```

Complexitate?

Matrix multiply

```
for(i=0; i<N; i++)
        for(j=0; j<N; j++)
                for(k=0; k<N; k++)
                        c[i][j] += a[i][k] * b[k][j]
```

Complexitate?

$$G = N^3$$

Matrix multiply

Atenție avem N^2 elemente

```
for(i=0; i<N; i++)
        for(j=0; j<N; j++)
                for(k=0; k<N; k++)
                        c[i][j] += a[i][k] * b[k][j]
```

Complexitate?

$$G = N^3$$

Matrix multiply

```
co[Tid = 1 to P]
{
        start = Tid * ceil(N/P)
        end = min((Tid+1) * ceil(N/P),N)
        for(i=start; i<end; i++)
                for(j=0; j<N; j++)
                        for(k=0; k<N; k++)
                                c[i][j] += a[i][k] * b[k][j]
}
```

Matrix multiply

Complexitate?

```
co[Tid = 1 to P]
{
        start = Tid * ceil(N/P)
        end = min((Tid+1) * ceil(N/P),N)
        for(i=start; i<end; i++)
                for(j=0; j<N; j++)
                        for(k=0; k<N; k++)
                                c[i][j] += a[i][k] * b[k][j]
}
```

Matrix multiply

Complexitate?

$$T = \frac{N^3}{P}$$

```
co[Tid = 1 to P]
{
        start = Tid * ceil(N/P)
        end = min((Tid+1) * ceil(N/P),N)
        for(i=start; i<end; i++)
                for(j=0; j<N; j++)
                        for(k=0; k<N; k++)
                                c[i][j] += a[i][k] * b[k][j]
}
```

Matrix multiply

Speedup?

$$T = \frac{N^3}{P}$$

```
co[Tid = 1 to P]
{
        start = Tid * ceil(N/P)
        end = min((Tid+1) * ceil(N/P),N)
        for(i=start; i<end; i++)
                for(j=0; j<N; j++)
                        for(k=0; k<N; k++)
                                c[i][j] += a[i][k] * b[k][j]
}
```

Matrix multiply

Speedup?

```
co[Tid = 1 to P]
{
        start = Tid * ceil(N/P)
        end = min((Tid+1) * ceil(N/P),N)
        for(i=start; i<end; i++)
                for(j=0; j<N; j++)
                        for(k=0; k<N; k++)
                                c[i][j] += a[i][k] * b[k][j]
}
```

$$S = \frac{N^3}{\frac{N^3}{P}}$$

Matrix multiply

Speedup?

$$S = P$$

```
co[Tid = 1 to P]
{
        start = Tid * ceil(N/P)
        end = min((Tid+1) * ceil(N/P),N)
        for(i=start; i<end; i++)
                for(j=0; j<N; j++)
                        for(k=0; k<N; k++)
                                c[i][j] += a[i][k] * b[k][j]
}
```

Floyd Warshall

```
for(k=0; k<N; k++)
        for(i=0; i<N; i++)
                for(j=0; j<N; j++)
                        c[i][j] = min(c[i][k] + c[k][j], c[i][j])
```

Super-linear speedup?

$S > P?$