





Măsurarea timpului de execuție

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



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



time sleep 5

real 0m5.001s

user 0m0.000s

sys 0m0.001s

time sleep 5

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

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



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

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.

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



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



Suma timpului petrecut în user space pe fiecare core.

time timeout 5 ./useAllCPU 12

real 0m4.075s

user 0m47.797s

sys 0m0.031s



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



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

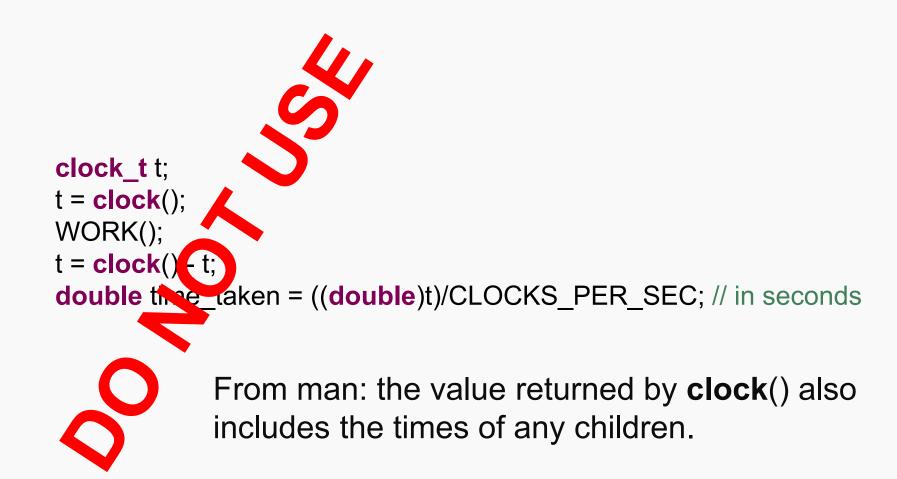


```
clock_t t;
t = clock();
WORK();
t = clock() - t;
double time_taken = ((double)t)/CLOCKS_PER_SEC; // in seconds
```



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







```
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

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

G – Timp execuție cel mai rapid algoritm secvențial



Costul C = T * P

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



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

* 3

27 18 27 12 6 21 18 15 18 ··· 3



969427656 ... 1

* 3

27



969427656 ... 1

* 3

27 18



969427656 ... 1

* 3

27 18 **27**



969427656 ... 1

* 3

27 18 **27** 12



969427656 ... 1

* 3

27 18 27 12 6 21 18 15 18 ··· 3



* 3

Complexitate paralelă?



969427656 ... 1

* 3

27 18 27 12 6 21 18 15 18 ··· 3

Complexitate paralelă? O(1)?



969427656 ... 1

* 3

27 18 27 12 6 21 18 15 18 ··· 3

Complexitate paralelă? O(1) ? P = N



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

* 3

27 18 27 12 6 21 18 15 18 ... 3

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



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



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



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

$$G = O(N)$$



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

$$G = O(N)$$

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



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

$$G = O(N)$$

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



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

Eficiența?

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

$$G = O(N)$$



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

Eficiența?

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

$$G = O(N)$$

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



Timpi adunare a doi vectori C = A + B

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



Sequential	Pthread (1 Thread)	Pthread(2 Thread)	Pthread(4 Thread)
user 0m6.141s	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			

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



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		

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



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	

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



Sequential	Pthread (1 Thread)	Pthread(2 Thread)	Pthread(4 Thread)
	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

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



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



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Sequential	Pthread (1 Thread)	Pthread(2 Thread)	Pthread(4 Thread)
user 0m6.141s	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			

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



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		

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



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	

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



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

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



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?



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.



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

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			



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

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		



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

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	



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

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

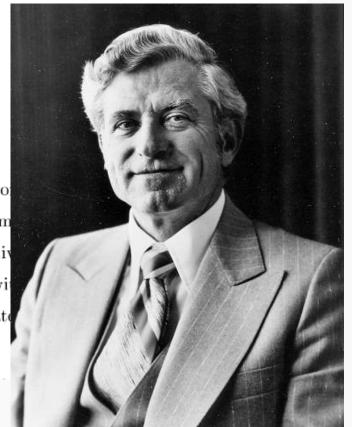


Validity of the single processor approach to achieving large scale computing capabilities¹

Gene M. Amdahl
IBM Sunnyvale, California

1 INTRODUCTION

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





Amdahl's law - prerequisits

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

(1-f) – Procentul de operații din algoritmul secvențial ce **NU** se pot executa paralel

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

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



Amdahl's law - prerequisits

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

(1-f) – Procentul de operații din algoritmul secvențial ce **NU** se pot executa paralel

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

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



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



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



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

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



Amdahl's law - prerequisits

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

(1-f) – Procentul de operații din algoritmul secvențial ce **NU** se pot executa paralel

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



Amdahl's law - prerequisits

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

(1-f) – Procentul de operații din algoritmul secvențial ce **NU** se pot executa paralel

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

$$T \geq (1-f)G$$





Pauză

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

Care este valoarea minimă ce poate fi printată?





Secvență Ne-paralelizabilă

Secvență Paralelizabilă

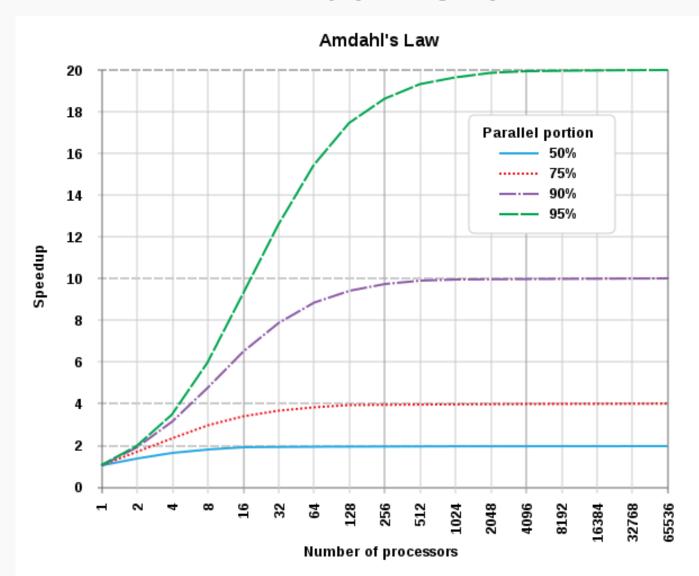
Secvență Ne-paralelizabilă

Secvență Paralelizată



Măsurare timp cu sau fără I/O?







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





Reminder

Ce este un semafor?



Ce este un mutex?

Ce este o barieră?





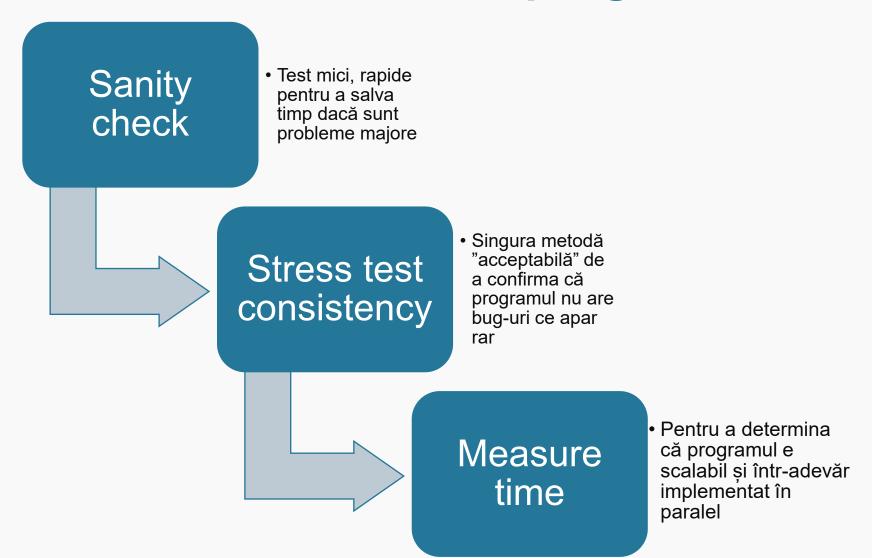
Consistența?

Demonstrație formală

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



Workflow - Testarea programelor







Let's parallelize some algorithms

THE CLASSIC WORK NEWLY UPDATED AND REVISED

The Art of Computer Programming

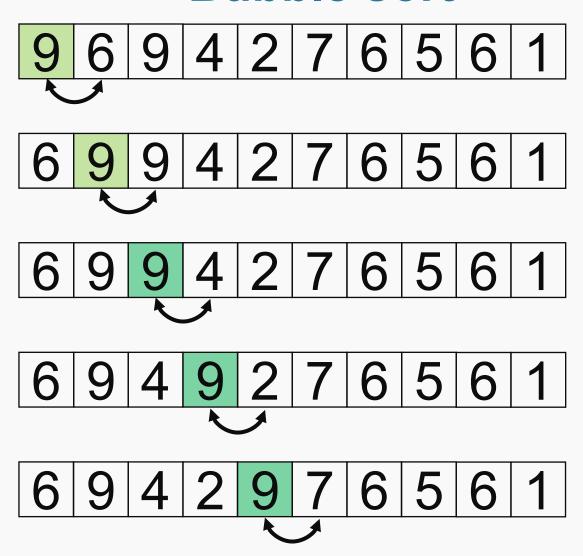
VOLUME 3

Sorting and Searching Second Edition

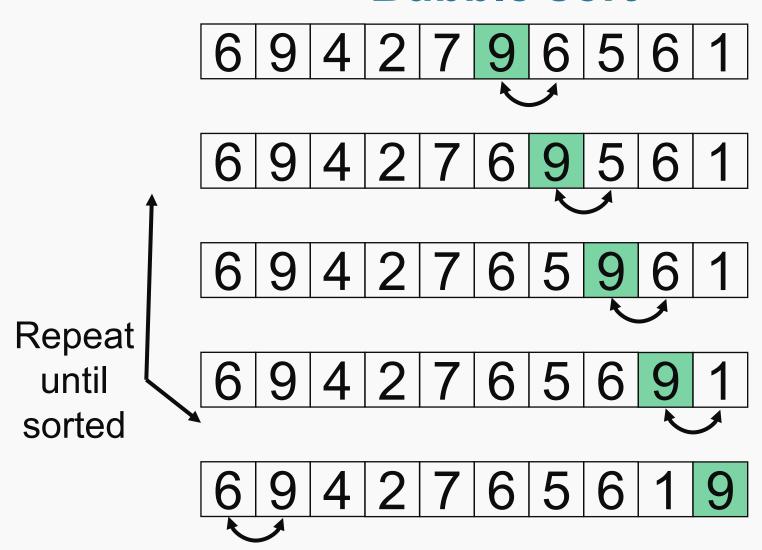
DONALD E. KNUTH



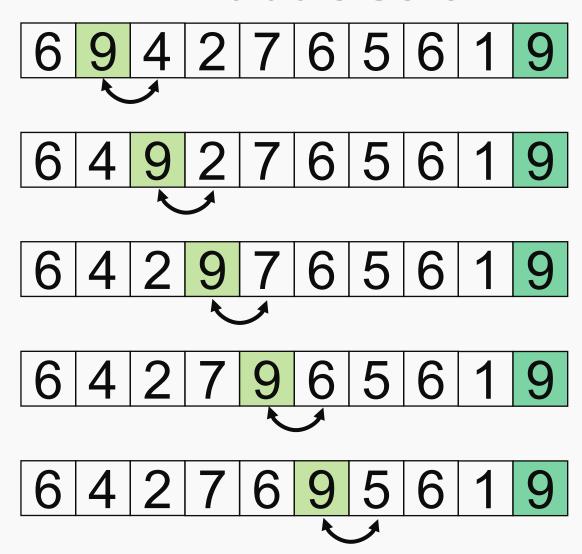




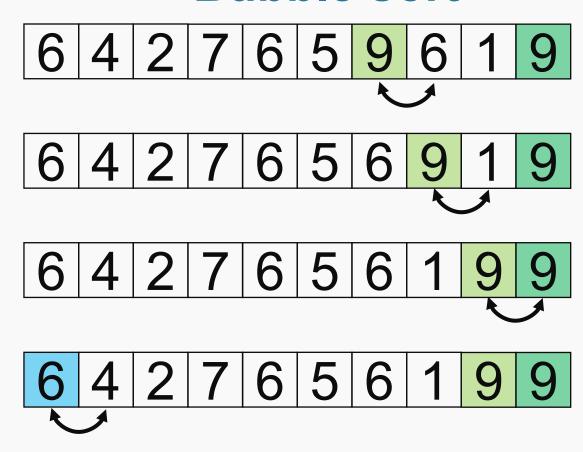














.

Complexitate?





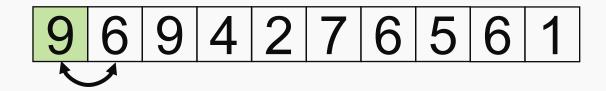
.

Complexitate: **O**(*N*²)
Un pas trece prin toate elementele
Garantat să termine după n repetiții

1 2 4 5 6 6 6 7 9 9



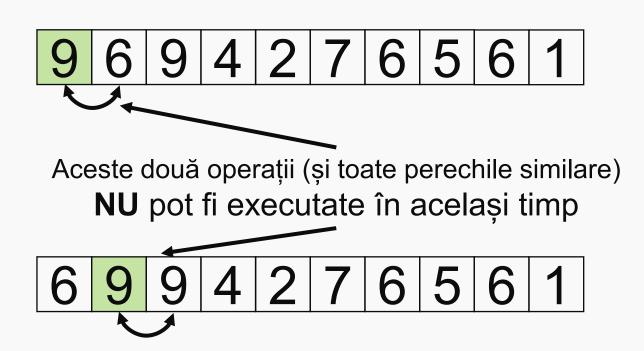
Parallel bubble sort



Cum paralelizăm?

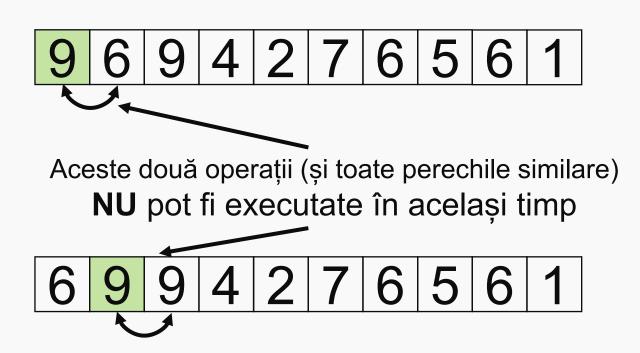


Parallel bubble sort





Parallel bubble sort



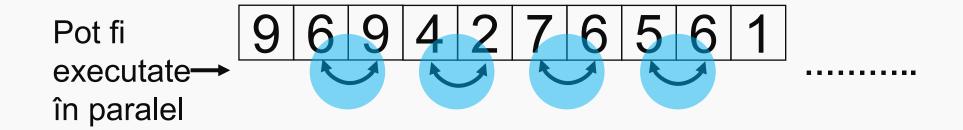
Hint: Nu este necesar ca operațiile să fie executate în această ordine





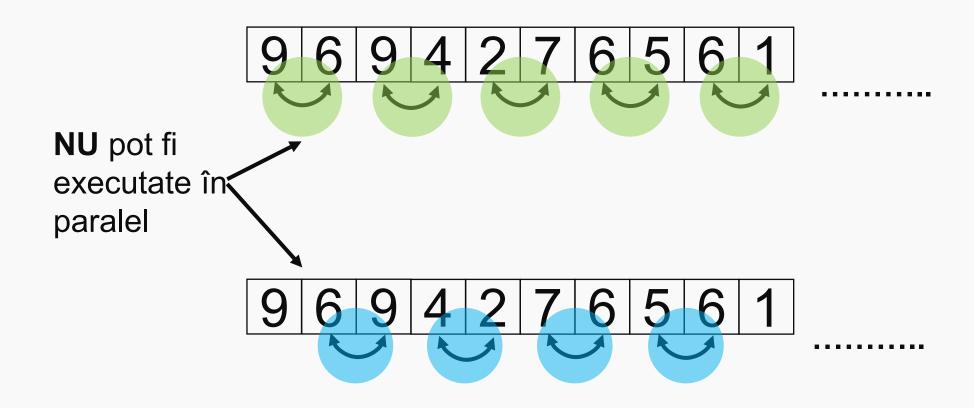




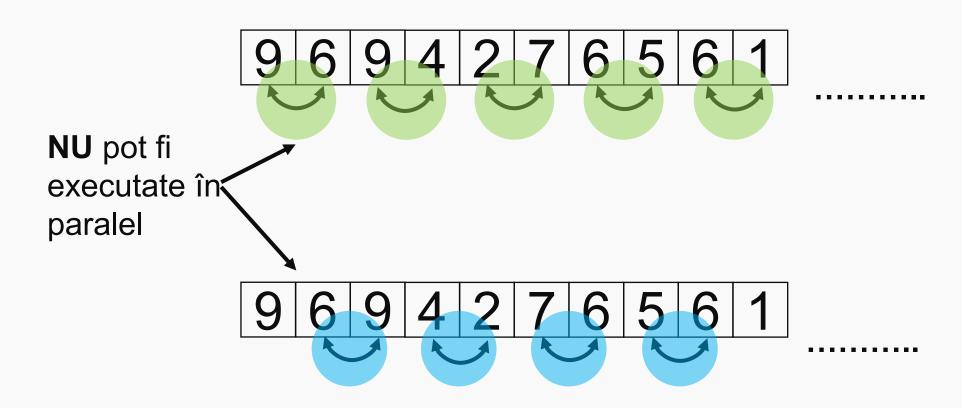


Cristian Chilipirea – Arhitecturi Paralele



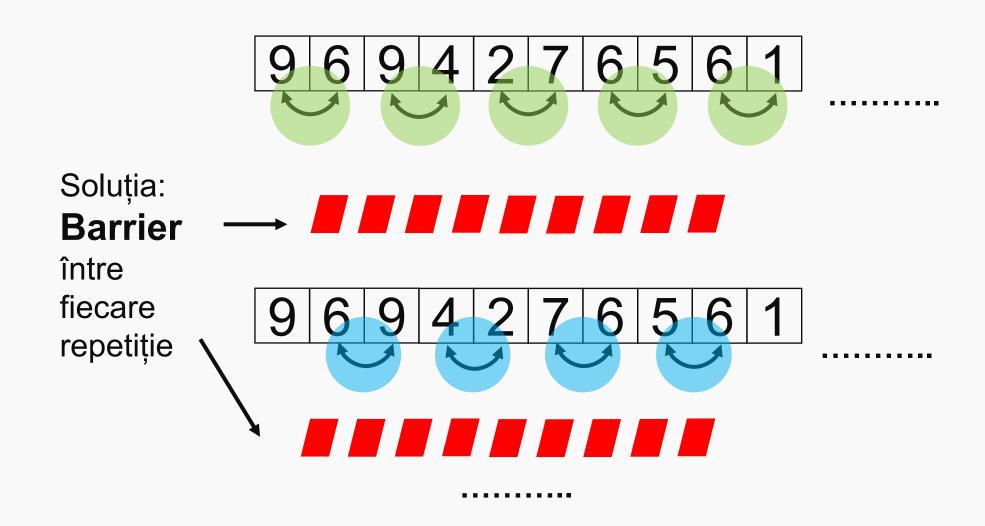




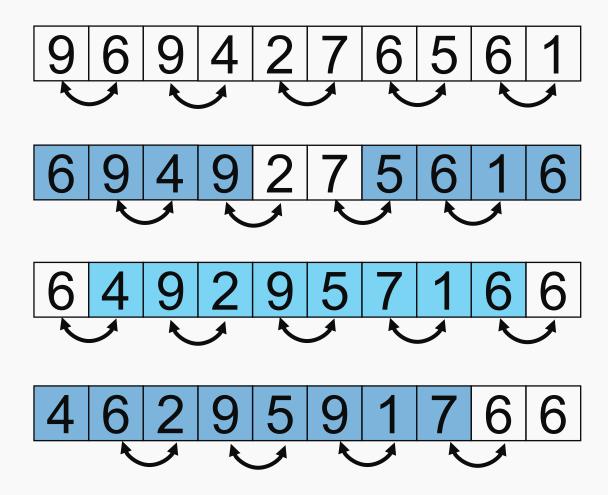


Ce facem? Ce folosim?

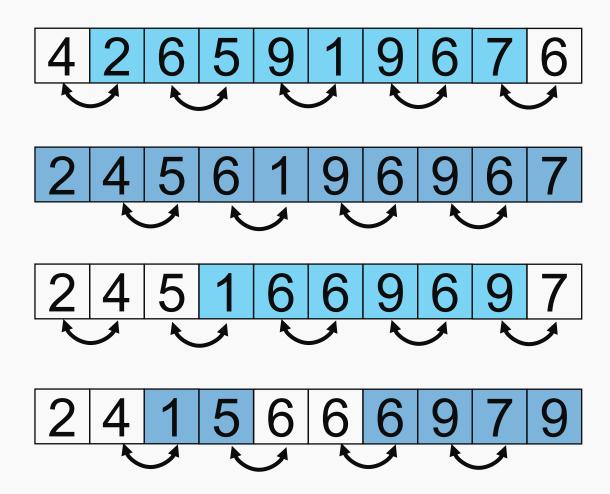




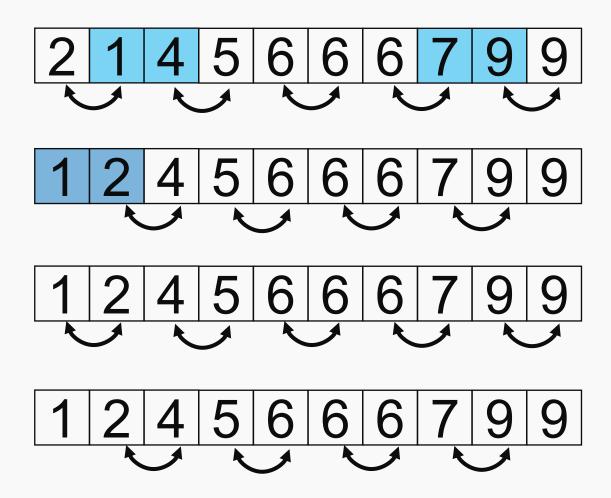




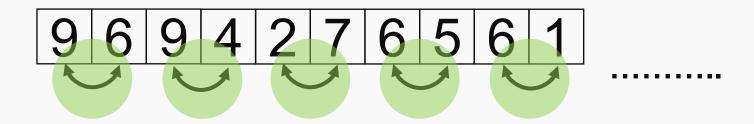








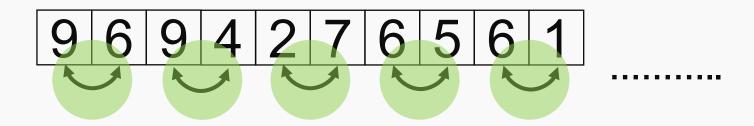




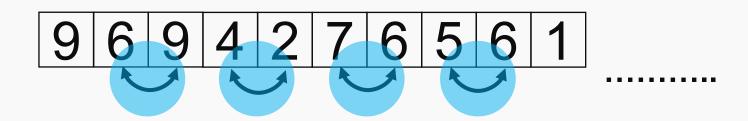
Complexitate a soluției paralele?





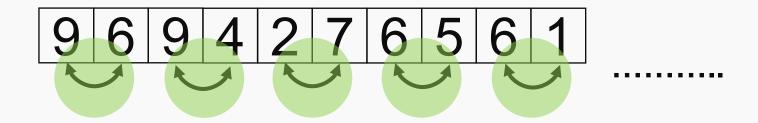


Complexitate a soluției paralele?



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





Speedup?

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





Speedup?

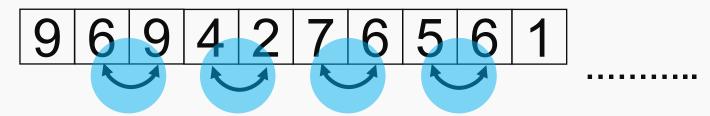


$$S = \frac{N^2}{\frac{N^2}{P}} = P$$



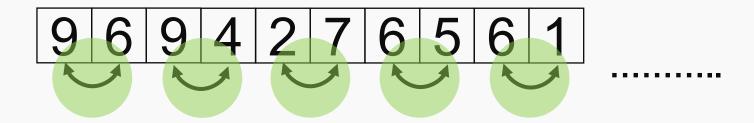


Speedup? But is it really?

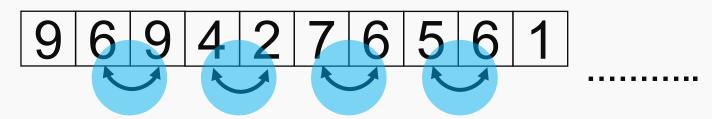


$$S = \frac{N^2}{\frac{N^2}{P}} = P$$



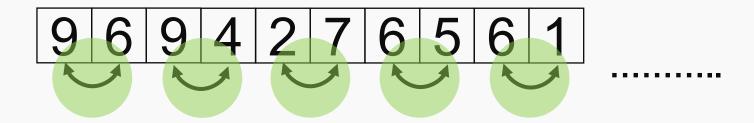


Speedup?

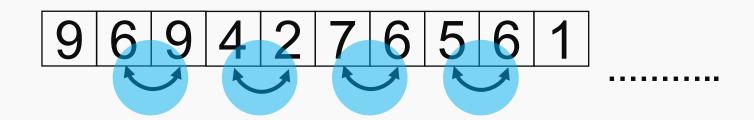


$$S = \frac{N \log_2 N}{\frac{N^2}{P}} \dots$$



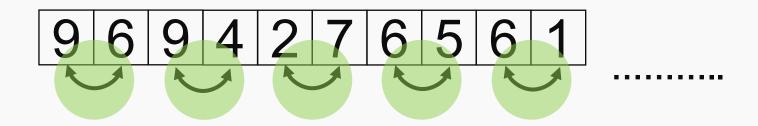


Speedup?

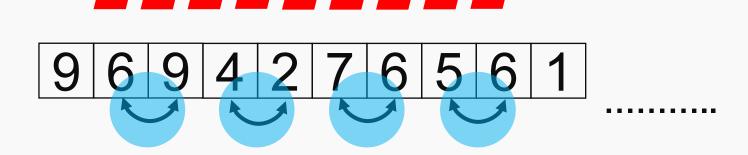


$$S = \frac{Plog_2N}{N}$$





Nu uitați așteptatul la barieră poate introduce timpi mari!

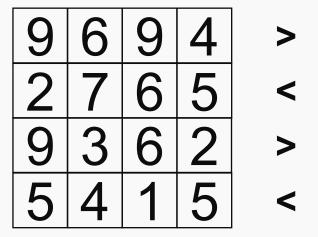


$$S = \frac{Plog_2N}{N}$$





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



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



9	6	9	4
2	7	6	5
9	3	60	2
5	4	1	5

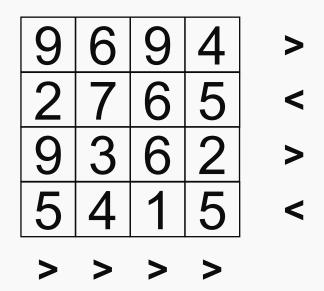
Sortează crescător coloanele



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

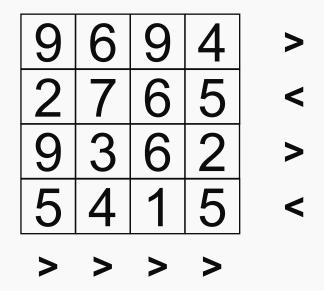
Repetă tot de log_2n ori





De ce liniile pare crescător și celelalte descrescător?





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



```
      4
      6
      9
      9
      >

      7
      6
      5
      2
      <</td>

      2
      3
      6
      9
      >

      5
      5
      4
      1
      <</td>
```



```
      2
      3
      4
      1

      4
      5
      5
      2

      5
      6
      6
      9

      7
      6
      9
      9
```



```
      1
      2
      3
      4
      >

      5
      5
      4
      2
      <</td>

      5
      6
      6
      9
      >

      9
      9
      7
      6
      <</td>
```



```
    1
    2
    3
    2

    5
    5
    4
    4

    5
    6
    6
    6

    9
    9
    7
    9
```



```
      1
      2
      2
      3
      >

      5
      5
      4
      4
      <</td>

      5
      6
      6
      6
      >

      9
      9
      9
      7
      <</td>
```



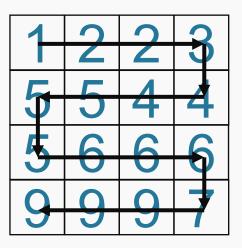
```
    1
    2
    2
    3

    5
    5
    4
    4

    5
    6
    6
    6

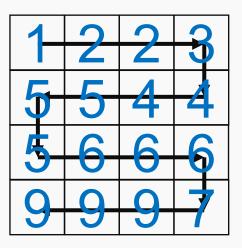
    9
    9
    9
    7
```





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





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



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

Complexitate? G =



```
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



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



Complexitate? $G = log_2N * 2 * \sqrt{N} * \sqrt{N} * log_2\sqrt{N}$ $\sqrt{N} * log_2\sqrt{N}$ cel mai bun algoritm secvențial de sortare



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



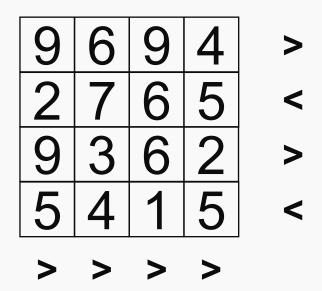
Complexitate? $G = Nlog_2N * log_2\sqrt{N}$ Cel mai bun algoritm secvențial rămâne $Nlog_2N$



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

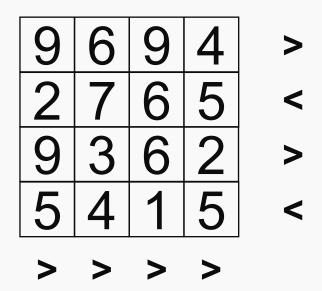
Cum paralelizăm?





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





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



Complexitate versiune paralelă?

$$G = log_2N * 2 * \sqrt{N} * \sqrt{N} * log_2\sqrt{N}$$



Complexitate versiune paralelă? N = P

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



Complexitate versiune paralelă? N = P

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



Complexitate versiune paralelă?

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



Complexitate versiune paralelă?

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



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

$$G = Nlog_2N$$



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

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

$$G = Nlog_2N$$



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

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

$$G = Nlog_2N$$





```
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]</pre>
```



```
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]</pre>
```



```
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]</pre>
```

$$G = N^3$$



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]</pre>
```

$$G = N^3$$





```
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]
}</pre>
```



```
co[Tid = 1 to P]  T = \frac{N^3}{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] }
```



```
co[Tid = 1 to P]  T = \frac{N^3}{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]
```



```
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]
}
```





Super-linear speedup?

S > P?