

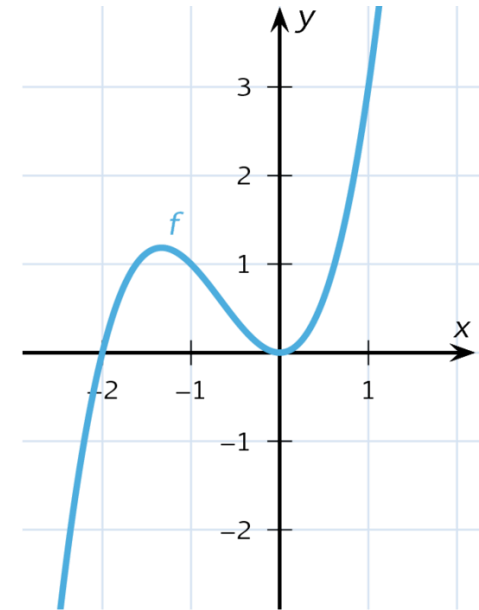
# **Grundlæggende Algoritmer og Datastrukturer**

Evaluering af polynomier  
Maximum delsum [Bentley kap. 8]

# Evaluering af Polynomier

- Vi har et  $n$ 'te grads polynomium  $P$ :

- $$P(x) = \alpha_n x^n + \alpha_{n-1} x^{n-1} + \dots + \alpha_1 x + \alpha_0$$

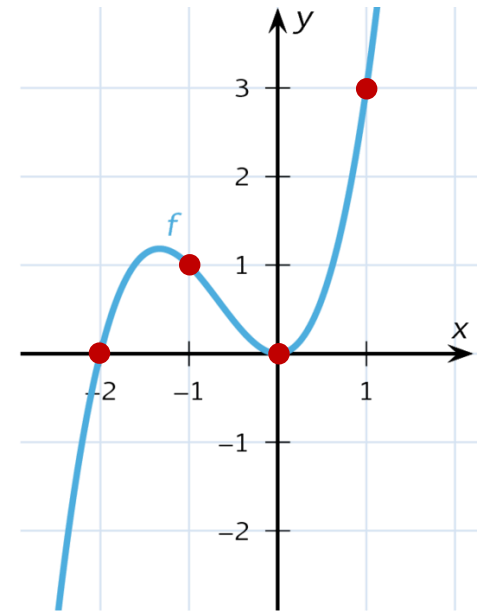


- Vi vil gerne evaluere det i et  $x$ .
- Hvor meget arbejde?

# Evaluering af Polynomier

## Eksempel

- $n = 3$
- $P(x) = x^3 + 2x^2$
- $\alpha_3=1, \alpha_2=2, \alpha_1=0, \alpha_0=0$
- $P(-2)=0, P(-1)=1, P(0)=0, P(1)=3$



# Evaluering af Polynomier

- $P(x) = \alpha_n x^n + \alpha_{n-1} x^{n-1} + \dots + \alpha_1 x + \alpha_0$
- **Beregn  $P(x)$**

$S = 0$

Delresultat

for  $i = 0, \dots, n$ :

$B = 1$

for  $j = 1, \dots, i$ :

$B = B * x$

$S = S + \alpha_j * B$

Få B til at blive  $x^i$

Udregn bidrag fra  $\alpha_j x^i$   
og læg til S

return S

# Evaluering af Polynomier

- $P(x) = \alpha_n x^n + \alpha_{n-1} x^{n-1} + \dots + \alpha_1 x + \alpha_0$

- **Beregn  $P(x)$**

$S = 0$

for  $i = 0, \dots, n$ :

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for  $j = 1, \dots, i$ :

$B = B * x$

$S = S + \alpha_i * B$

return  $S$

Hvor mange gange bliver

$B = B * x$  ca. udført?

a)  $\log_2(n)$

b)  $n$

c)  $n * \log_2(n)$

d)  $n^2$

e)  $n^3$

# Evaluering af Polynomier

- **Beregn  $P(x)$**

$S = 0$

for  $i = 0, \dots, n$ :

$B = 1$

for  $j = 1, \dots, i$ :

$B = B * x$

$S = S + \alpha_j * B$

return  $S$

Vi laver næsten det samme arbejde for  $i-1$  og  $i$

Lad os prøve at genbruge resultater!

# Evaluering af Polynomier

- Beregn  $P(x)$

$S = 0$

for  $i = 0, \dots, n$ :

$B = 1$

for  $j = 1, \dots, i$ :

$B = B * x$

$S = S + \alpha_j * B$

return  $S$

$n^2/2 + n/2$

- Beregn  $P(x)$

*ny*

$S = 0$

$B = 1$

for  $i = 0, \dots, n$ :

$S = S + \alpha_i * B$

$B = B * x$

return  $S$

$2(n+1)$

# Evaluering af Polynomier

- Hvor stor forskel på moderne computer der kan lave ca.  $10^9$  instruktioner på 1 sekund?

Degree $n$ :	$10^2$	$10^4$	$10^6$	$10^8$
Naive ( $n^2/2 + n/2$ work):	5 microseconds	50 milliseconds	8 minutes	2 months
Re-use ( $2(n + 1)$ work):	0.1 microseconds	20 microseconds	2 milliseconds	0.2 seconds



# Programming Pearls

Second Edition

**JON BENTLEY**

Bell Labs, Lucent Technologies  
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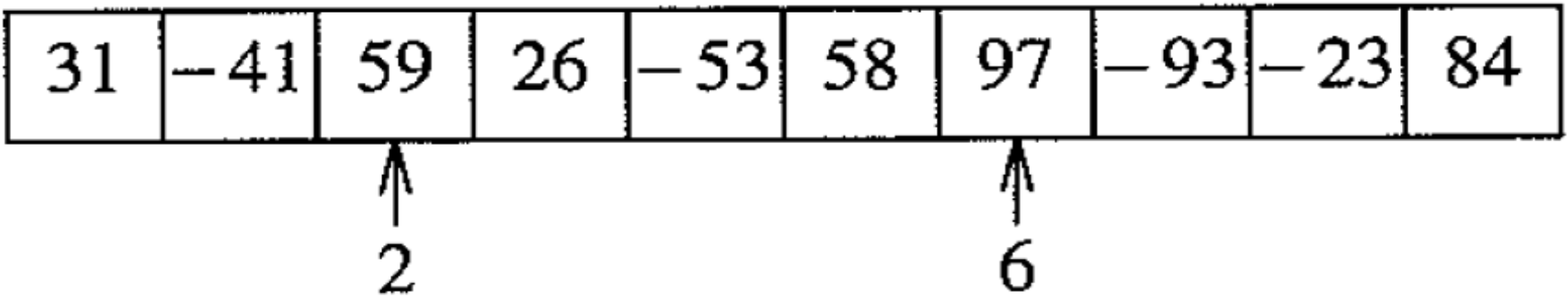


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# Max-DeIsum



# Hvad er Max-Delsum ?

0	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16
3	5	-4	-5	2	-3	4	2	-3	5	6	-2	3	-7	2	-6	10

- a) 10
- b) 11
- c) 14
- d) 15
- e) 17
- f) 20
- g) 30
- h) ved ikke

# Algoritme 1

```
1 maxsofar = 0
2 for i = [0, n)
3     for j = [i, n)
4         sum = 0
5         for k = [i, j]
6             sum += x[k]
7         /* sum is sum of x[i..j] */
8         maxsofar = max(maxsofar, sum)
```

Antal additioner:

$$\sum_{l=1}^n l(n-l+1) = (n+1) \sum_{l=1}^n l - \sum_{l=1}^n l^2 = (n+1) \frac{n(n+1)}{2} - \frac{n(n+1)(2n+1)}{6} = \frac{n^3 + 3n^2 + 2n}{6}$$

# Algorithme 2

```
1 maxsofar = 0
2 for i = [0, n)
3     sum = 0
4     for j = [i, n)
5         sum += x[j]
6         /* sum is sum of x[i..j] */
7         maxsofar = max(maxsofar, sum)
```

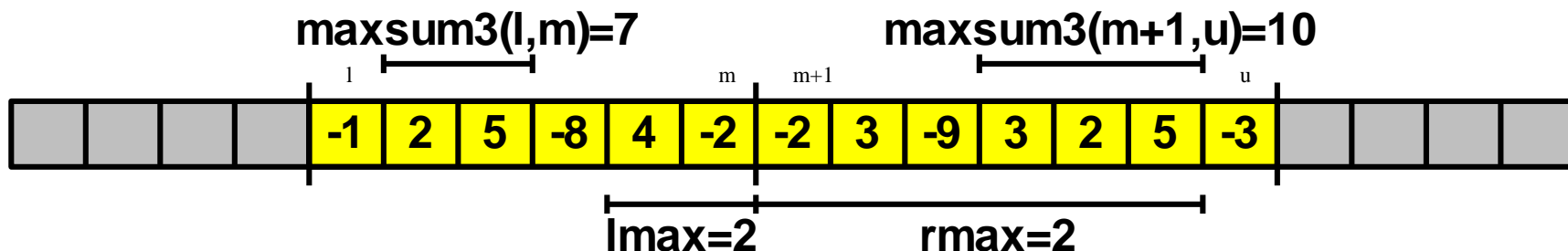
# Algorithme 2b

```
1 cumarr[-1] = 0
2 for i = [0, n)
3     cumarr[i] = cumarr[i-1] + x[i]
4 maxsofar = 0
5 for i = [0, n)
6     for j = [i, n)
7         sum = cumarr[j] - cumarr[i-1]
8         /* sum is sum of x[i..j] */
9         maxsofar = max(maxsofar, sum)
```

# Algoritme 3

```
1 answer := maxsum3(0, n-1)
2 float maxsum3(l, u)
3     if (l > u) /* zero elements */
4         return 0
5     if (l == u) /* one element */
6         return max(0, x[l])
7
8     m = (l + u) / 2
9     /* find max crossing to left */
10    lmax = sum = 0
11    for (i = m; i >= l; i--)
12        sum += x[i]
13        lmax = max(lmax, sum)
14    /* find max crossing to right */
15    rmax = sum = 0
16    for i = (m, u]
17        sum += x[i]
18        rmax = max(rmax, sum)
19
20    return max(lmax+rmax, maxsum3(l, m), maxsum3(m+1, u))
```

rekursive  
metodekald

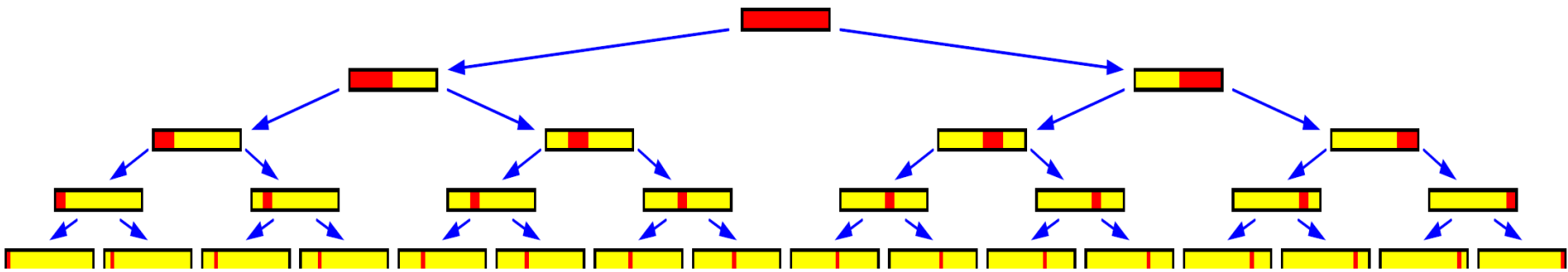






# Algoritme 3 : Analyse

## Rekursionstræet



## Observation

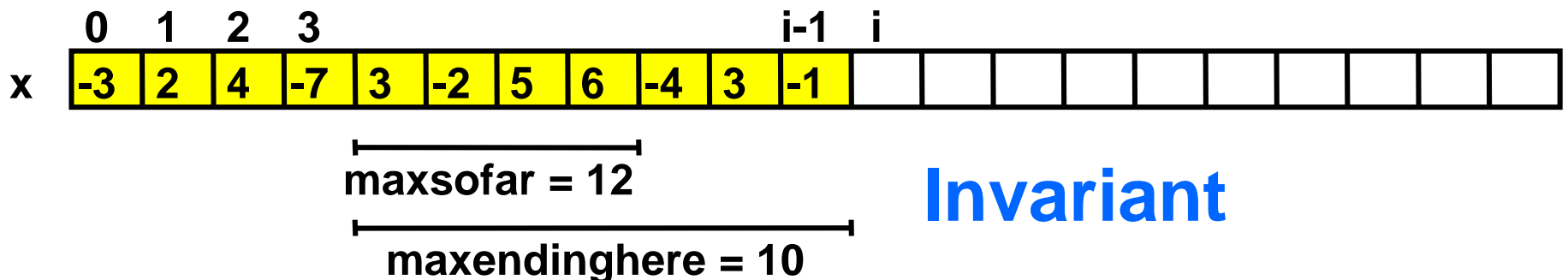
Samlet mængde additioner per lag er  $\sim n$

## Additioner

# additioner  $\sim n \cdot \# \text{ lag} \sim n \cdot \log_2 n$

# Algorithme 4

```
1 maxsofar = 0
2 maxendinghere = 0
3 for i = [0, n)
4     /* invariant: maxendinghere and maxsofar
5        are accurate for x[0..i-1] */
6     maxendinghere = max(maxendinghere + x[i], 0)
7     maxsofar = max(maxsofar, maxendinghere)
```



# Max-Delsum: Algoritmiske idéer

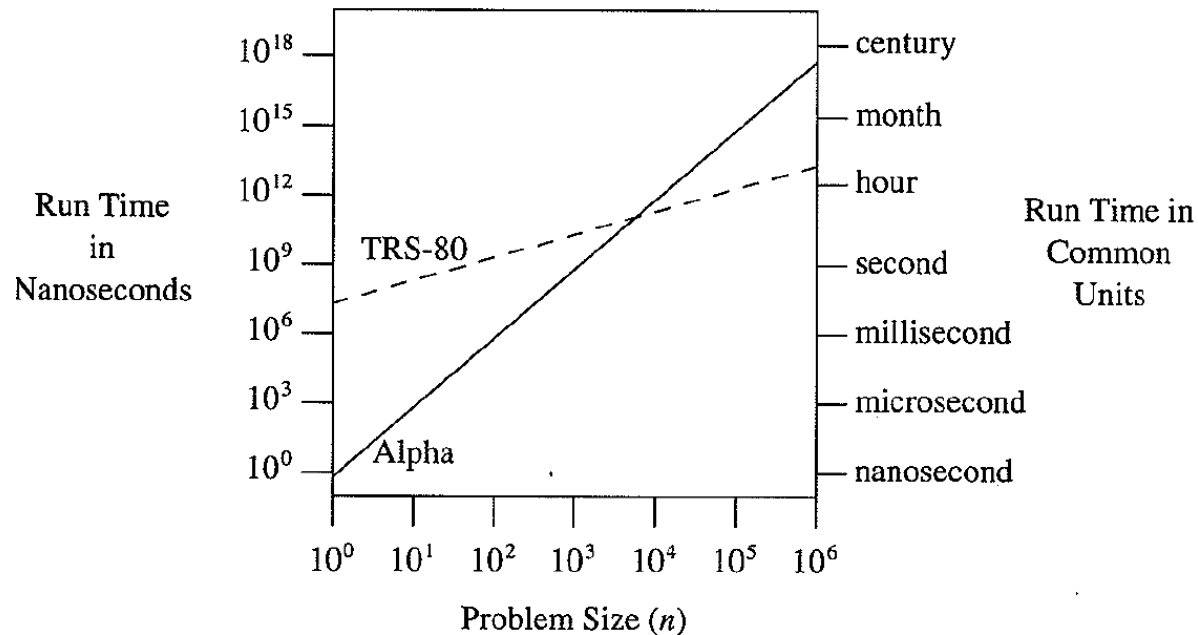
Algoritme	# additioner	Idé
1	$\sim n^3$	Naive løsning
$2 + 2b$	$\sim n^2$	<b>Genbrug beregninger</b> $\text{sum}(x[i..j]) = \text{sum}(x[i..j-1]) + x[j]$ $\text{sum}(x[i..j]) = \text{sum}(x[0..j]) - \text{sum}(x[0..i-1])$
3	$\sim n \cdot \log n$	Del-og-kombiner
4	$\sim n$	Inkrementel

# Sammenligning

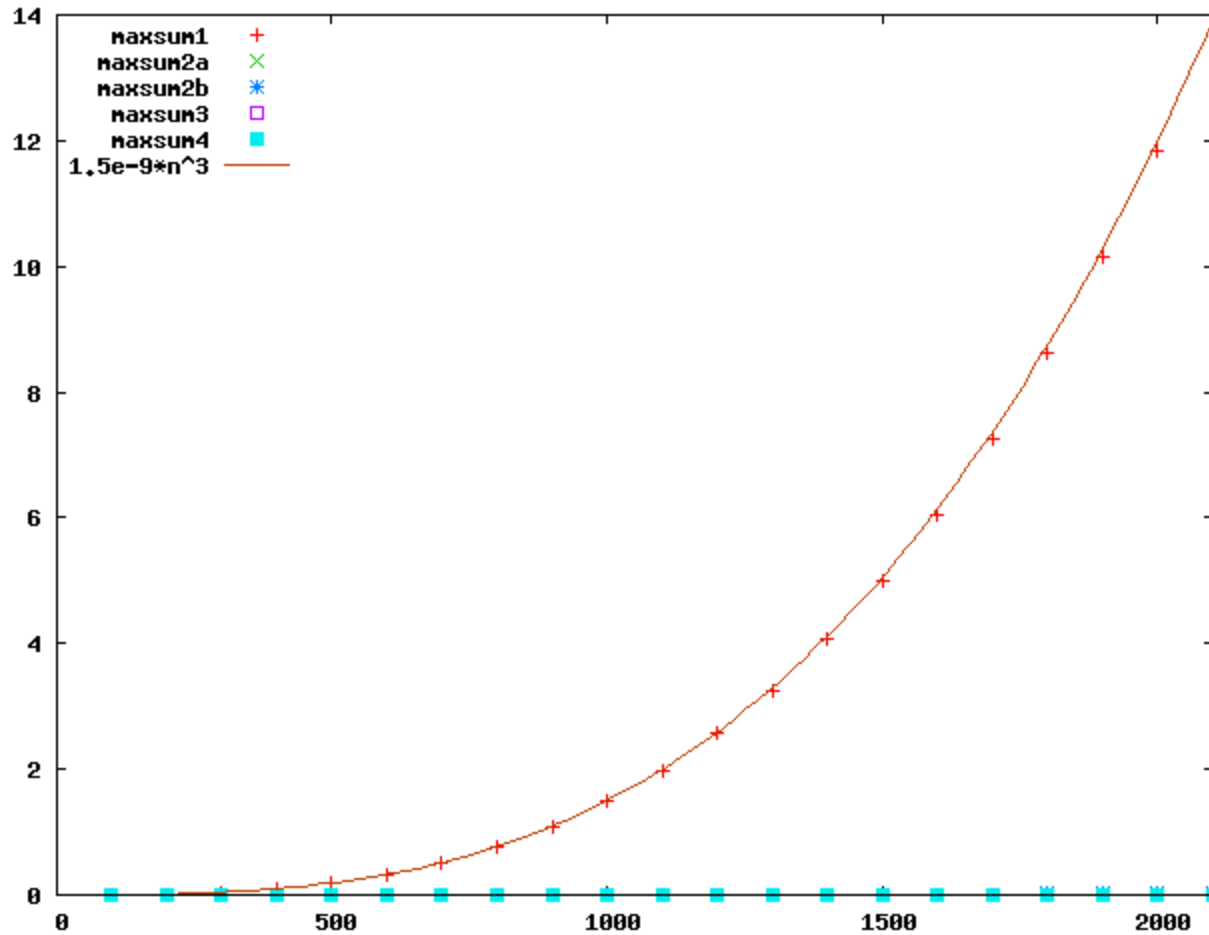
ALGORITHM		1	2	3	4
Run time in nanoseconds		$1.3n^3$	$10n^2$	$47n \log_2 n$	$48n$
Time to solve a problem of size	$10^3$	1.3 secs	10 msecs	.4 msecs	.05 msecs
	$10^4$	22 mins	1 sec	6 msecs	.5 msecs
	$10^5$	15 days	1.7 min	78 msecs	5 msecs
	$10^6$	41 yrs	2.8 hrs	.94 secs	48 msecs
	$10^7$	41 millennia	1.7 wks	11 secs	.48 secs
Max size problem solved in one	sec	920	10,000	$1.0 \times 10^6$	$2.1 \times 10^7$
	min	3600	77,000	$4.9 \times 10^7$	$1.3 \times 10^9$
	hr	14,000	$6.0 \times 10^5$	$2.4 \times 10^9$	$7.6 \times 10^{10}$
	day	41,000	$2.9 \times 10^6$	$5.0 \times 10^{10}$	$1.8 \times 10^{12}$
If $n$ multiplies by 10, time multiplies by		1000	100	10+	10
If time multiplies by 10, $n$ multiplies by		2.15	3.16	10-	10

# Sammenligning: $n^3$ og $n$

$n$	ALPHA 21164A, C, CUBIC ALGORITHM	TRS-80, BASIC, LINEAR ALGORITHM
10	0.6 microseconds	200 milliseconds
100	0.6 milliseconds	2.0 secs
1000	0.6 secs	20 secs
10,000	10 mins	3.2 mins
100,000	7 days	32 mins
1,000,000	19 yrs	5.4 hrs

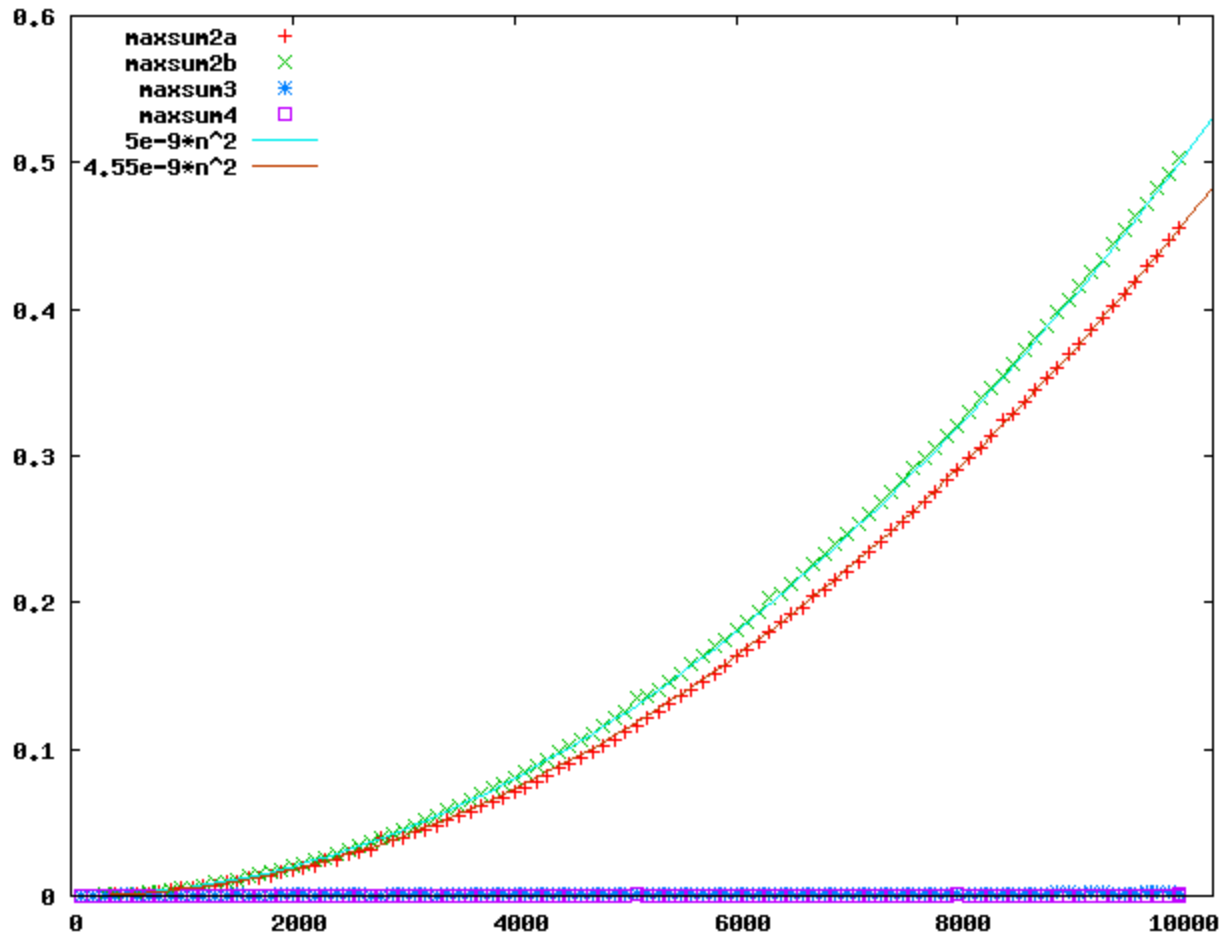


# Sammenligning 2009



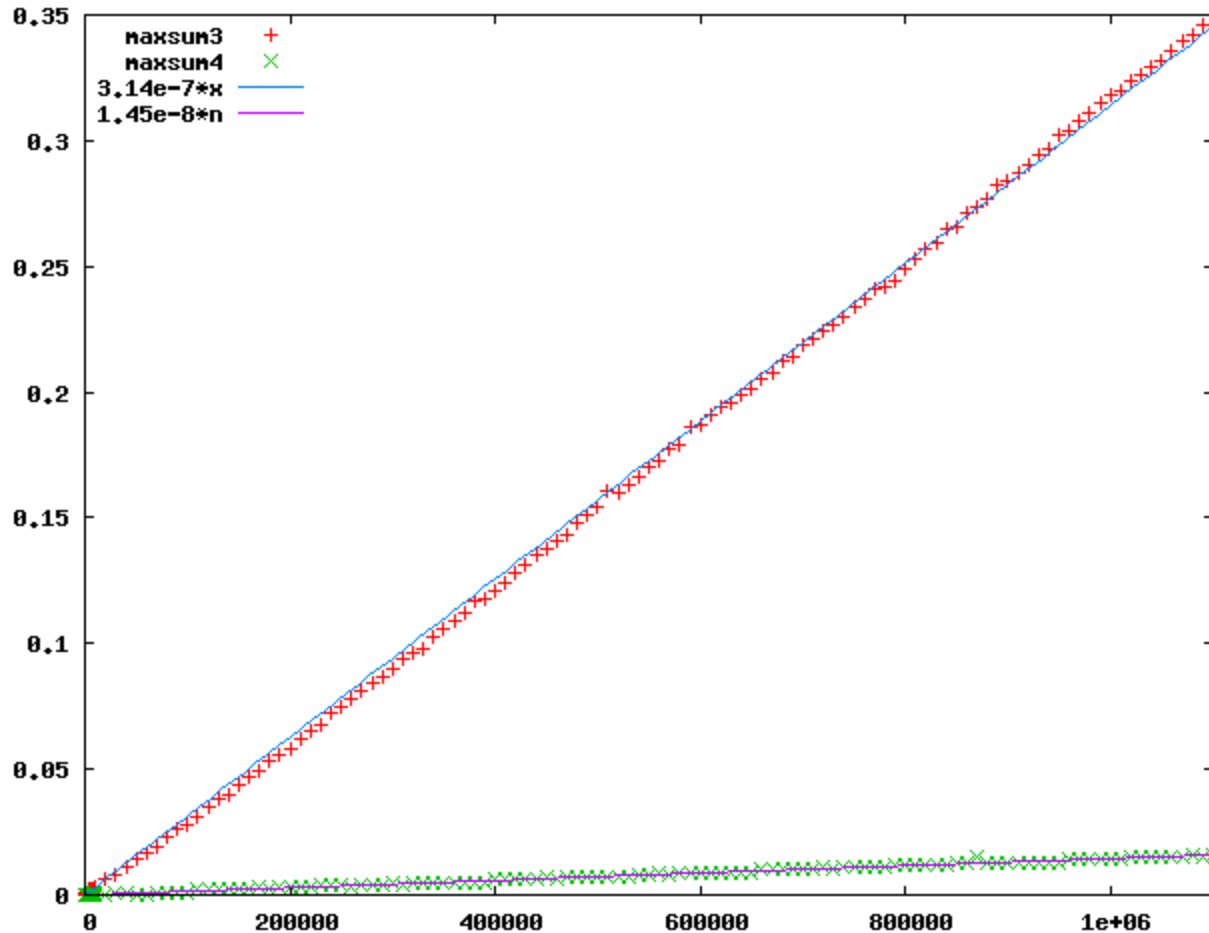
$$\text{maxsum1} \approx n^3$$

# Sammenligning 2009



maxsum2a og maxsum2b  $\approx n^2$

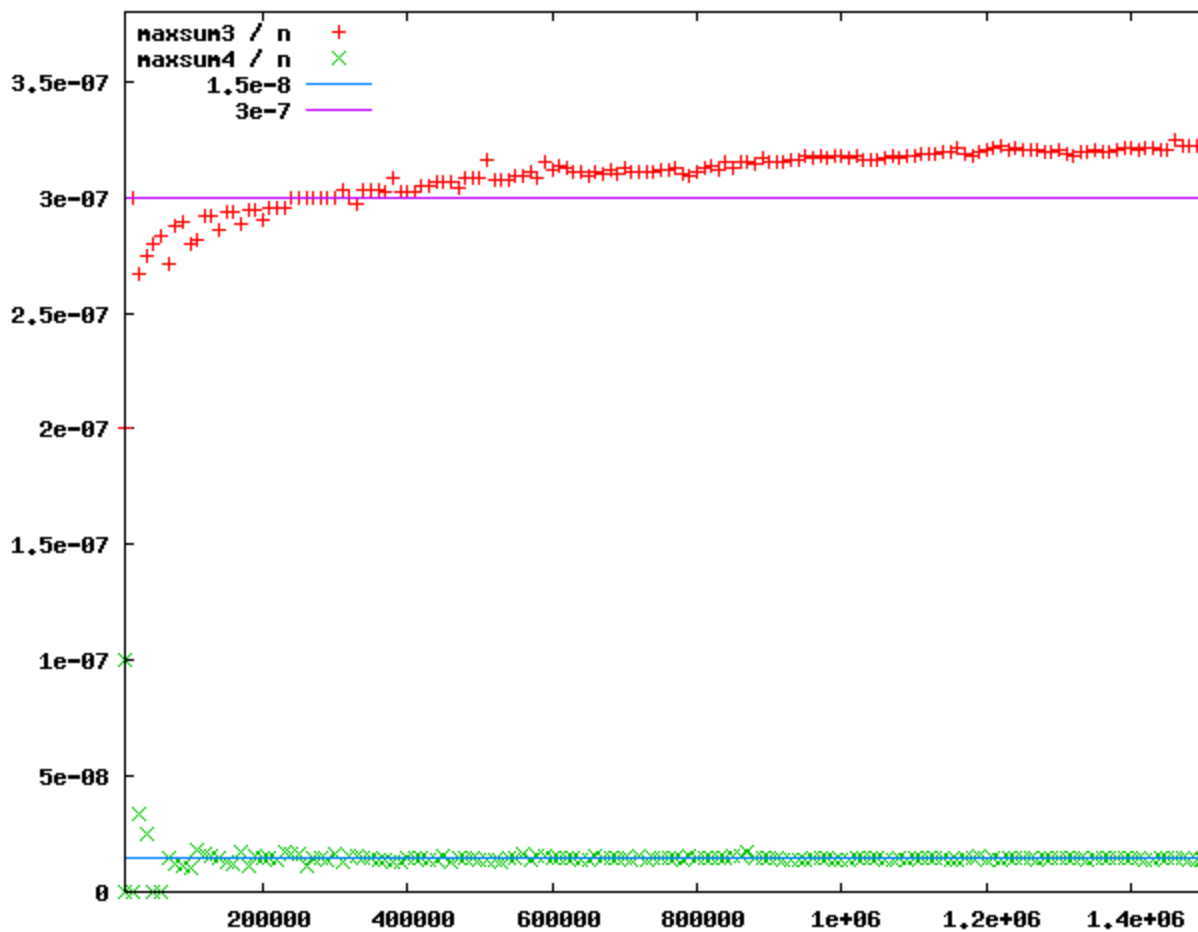
# Sammenligning 2009



maxsum3 og maxsum4  $\approx n$  ???

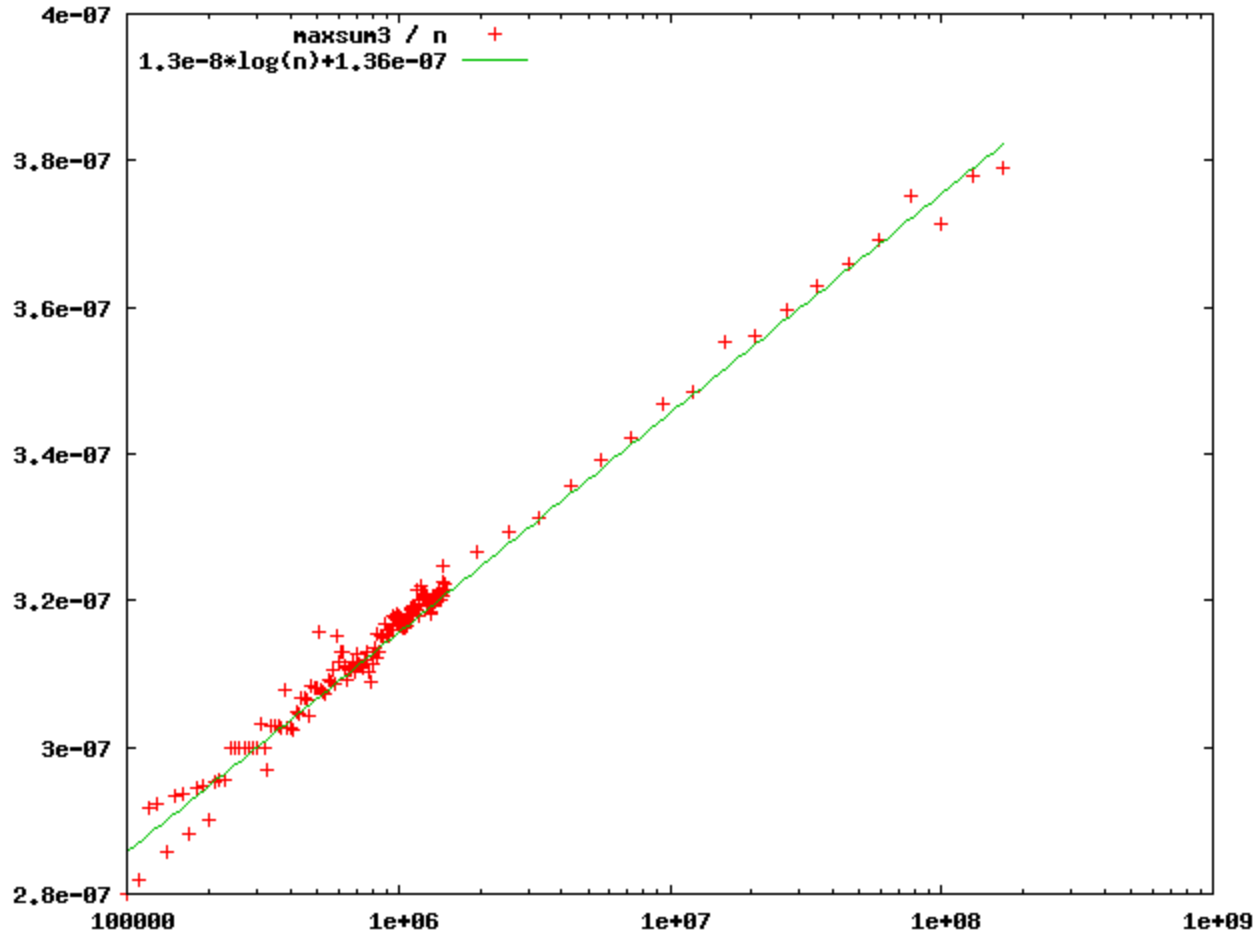


# Sammenligning 2009



$$\text{maxsum4} \approx n$$

# Sammenligning 2009



$$\text{maxsum3} \approx c_1 \cdot n \cdot \log n + c_2 \cdot n$$

# Algoritmisk indsigt...

- Gode idéer kan give hurtige algoritmer
- Generelle algoritme teknikker
  - Del-og-kombiner
  - Inkrementel
- Analyse af udførelsestid
- Argumenteret for korrektheden
- Invarianter

# Afleveringsopgave

- Bentley 8.7.13:

-10	5	24	3	-100	4
56	5	-13	-16	80	-10
3	-2	0	-10	19	45
-34	-20	100	4	-5	10
18	8	-6	-4	-50	-50
3	14	-42	-33	15	7

- Find største sum i et del-rektangel.
- Input  $n \times n$ . Alt fra  $n^6$  og ned er OK.
- Prøv at argumentere for tid og korrekthed.