

# POLY : A new polynomial data structure for Maple 17 that improves parallel speedup.

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This is joint work with Roman Pearce.

- Polynomial data structures in Maple and Singular are slow.  
Our data structure.

# Talk Outline

- Polynomial data structures in Maple and Singular are slow.  
Our data structure.
- Johnson's polynomial multiplication using a heap from 1973.  
Our parallelization of it.  
A multiplication and factorization benchmark in Maple 16.

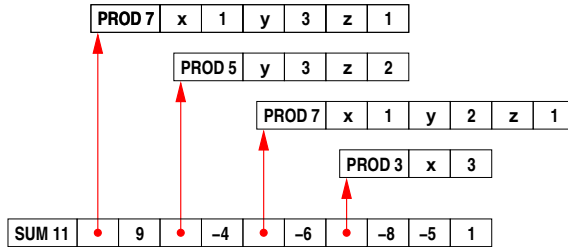
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Solution and new timings.

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Solution and new timings.
- Notes on integration into Maple kernel for Maple  $\geq 17$ .
- Conclusion

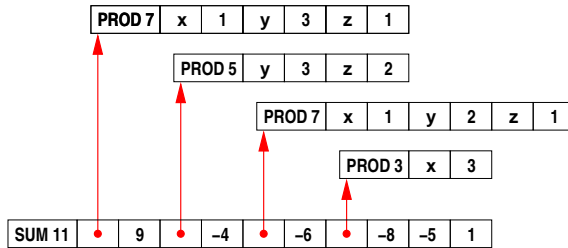
# Representations for $9xy^3z - 4y^3z^2 - 6xy^2z - 8x^3 - 5$ .

Maple 16

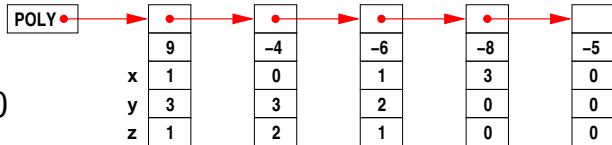


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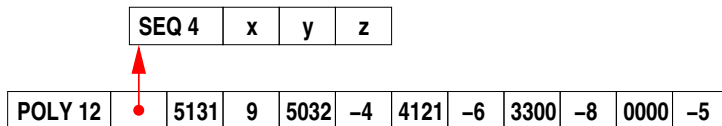


Singular 3.0



- Memory access is not sequential.
- Monomial multiplication costs  $O(100)$  cycles.

# Our representation $9xy^3z - 4y^3z^2 - 6xy^2z - 8x^3 - 5$ .



Monomial encoding for **graded lex order** with  $x > y > z$

Encodes  $x^i y^j z^k$  in a single word 

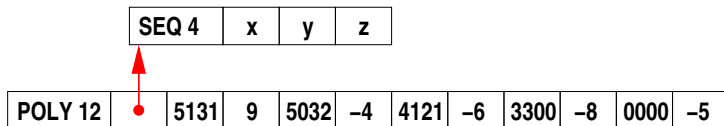
$d$	$i$	$j$	$k$
-----	-----	-----	-----

 where  $d = i + j + k$ .

## Advantages



# Our representation $9xy^3z - 4y^3z^2 - 6xy^2z - 8x^3 - 5$ .



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Encodes  $x^i y^j z^k$  in a single word 

$d$	$i$	$j$	$k$
-----	-----	-----	-----

 where  $d = i + j + k$ .

## Advantages

- It's more compact.
- Memory access is sequential.
- Fewer objects to clutter tables.
- Monomial  $>$  and  $\times$  cost **one** instruction.

# Multiplication using a binary heap.

Let  $f = f_1 + f_2 + \cdots + f_n$  and  $g = g_1 + g_2 + \cdots + g_m$ .

Compute  $f \times g = f_1 \cdot g + f_2 \cdot g + \cdots + f_n \cdot g$ .

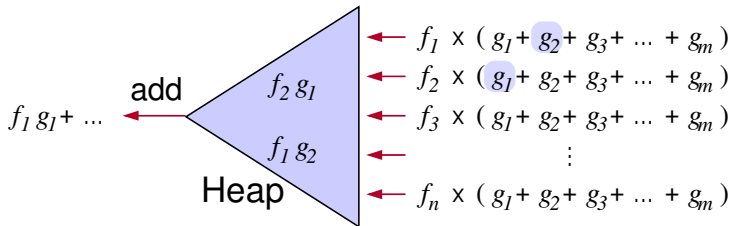
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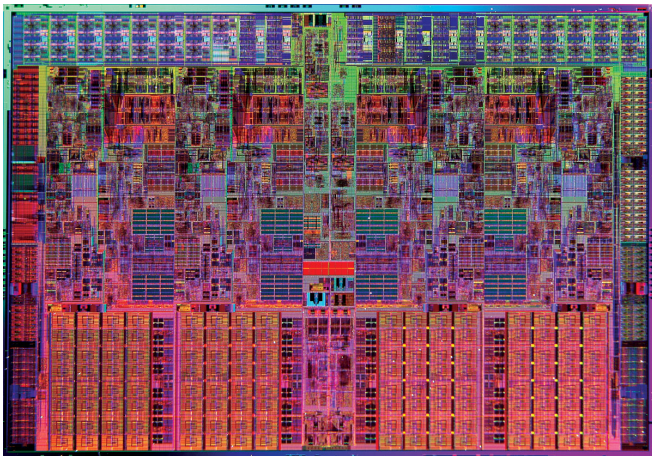
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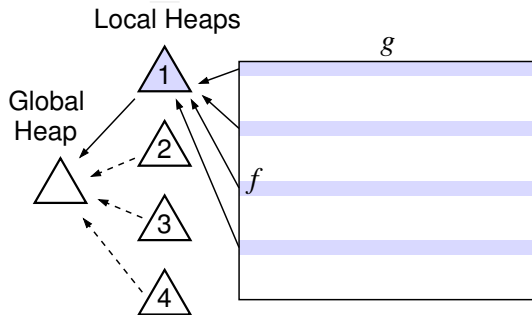
- $|Heap| \leq n \implies O(nm \log n)$  comparisons.
- Can pick  $n \leq m$ .
- Algorithm outputs  $f \times g$  in descending order.

# Target Parallel Architecture



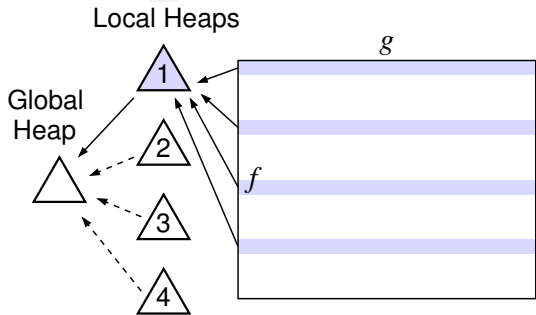
Intel Core i7, quad core, shared memory.

# Parallel Multiplication Algorithm



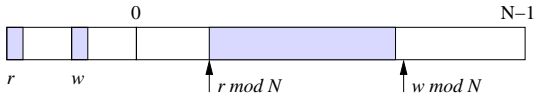
One heap per core.  
Add (merge) results  
in global heap.

# Parallel Multiplication Algorithm



One heap per core.  
Add (merge) results  
in global heap.

Threads write to a finite circular buffer.



Threads try to acquire global heap as buffer fills up to balance load.

# Old multiplication and factorization benchmark.

Intel Core i5 750 2.66 GHz (4 cores)

Times in seconds

	Maple 13	Maple 16		Magma	Singular	Mathem atica 7
multiply		1 core	4 cores			
$p_1 := f_1(f_1 + 1)$	1.60	0.053	0.029	0.30	0.58	4.79
$p_3 := f_3(f_3 + 1)$	26.76	0.422	0.167	4.09	6.96	50.36
$p_4 := f_4(f_4 + 1)$	95.97	1.810	0.632	13.25	30.64	273.01
factor	Hensel lifting is mostly polynomial multiplication!!					
$p_1$ 12341 terms	31.10	2.58	2.46	6.15	12.28	11.82
$p_3$ 38711 terms	391.44	15.19	13.00	117.53	97.10	164.50
$p_4$ 135751 terms	2953.54	53.52	44.84	332.86	404.86	655.49

$$\begin{aligned}f_1 &= (1 + x + y + z)^{20} + 1 && 1771 \text{ terms} \\f_3 &= (1 + x + y + z)^{30} + 1 && 5456 \text{ terms} \\f_4 &= (1 + x + y + z + t)^{20} + 1 && 10626 \text{ terms}\end{aligned}$$

The Maple timings are for `expand(f1*(f1+1))` and `factor(p1)`.

# Maple Integration

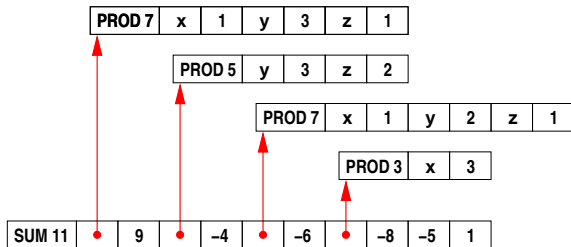
To expand sums  $f \times g$  Maple calls 'expand/bigprod(f,g)' if  $\#f > 2$  and  $\#g > 2$  and  $\#f \times \#g > 1500$ .

```
'expand/bigprod' := proc(a,b) # multiply two large sums
  if type(a, polynom(integer)) and type(b, polynom(integer)) then
    x := indets(a) union indets(b); k := nops(x);
    A := sdmp:-Import(a, plex(op(x)), pack=k);
    B := sdmp:-Import(b, plex(op(x)), pack=k);
    C := sdmp:-Multiply(A,B);
    return sdmp:-Export(C);
  else
    ...
```

```
'expand/bigdiv' := proc(a,b,q) # divide two large sums
  ...
  x := indets(a) union indets(b); k := nops(x)+1;
  A := sdmp:-Import(a, grlex(op(x)), pack=k);
  B := sdmp:-Import(b, grlex(op(x)), pack=k);
  ...
```



# Almost everything is slow.



Many operations cost  $O(nt)$ . [  $n = \#variables$ ,  $t = \#terms$  ]

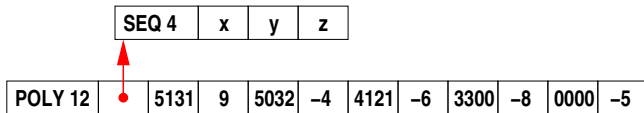
E.g. `indets(f)`; `degree(f,x)`; `coeff(f,x,i)`;

Some operations add sorting cost of  $O(t^{1.25})$ .

E.g. `diff(f,x)`; `expand(x*f)`; `taylor(f,x,d)`;

# Make POLY the default representation in Maple.

If we can pack all monomials into one word use



$O(1)$	<code>degree(f); lcoeff(f); indets(f);</code>
$O(n)$	<code>has(f,z); type(f, polynom(integer));</code>
$O(n + t)$	<code>degree(f,x); expand(x*t); diff(f,x);</code>

For  $f$  with  $t$  terms in  $n$  variables.

# Almost everything is fast.

command	Maple 16	Maple 17	speedup	notes
<code>coeff(<math>f, x, 20</math>)</code>	2.140 s	0.005 s	420x	terms easy to locate
<code>coeffs(<math>f, x</math>)</code>	0.979 s	0.119 s	8x	reorder exponents and radix
<code>frontend(<math>g, [f]</math>)</code>	3.730 s	0.000 s	$\rightarrow O(n)$	looks at variables only
<code>degree(<math>f, x</math>)</code>	0.073 s	0.003 s	24x	stop early using monomial de
<code>diff(<math>f, x</math>)</code>	0.956 s	0.031 s	30x	terms remain sorted
<code>eval(<math>f, x = 6</math>)</code>	3.760 s	0.175 s	21x	use Horner form recursively
<code>expand(<math>2 * x * f</math>)</code>	1.190 s	0.066 s	18x	terms remain sorted
<code>indets(<math>f</math>)</code>	0.060 s	0.000 s	$\rightarrow O(1)$	first word in dag
<code>subs(<math>x = y, f</math>)</code>	1.160 s	0.076 s	15x	combine exponents, sort, me
<code>taylor(<math>f, x, 50</math>)</code>	0.668 s	0.055 s	12x	get coefficients in one pass
<code>type(<math>f, \text{polynom}</math>)</code>	0.029 s	0.000 s	$\rightarrow O(n)$	type check variables only

For  $f$  with  $n = 3$  variables and  $t = 10^6$  terms created by

```
f := expand(mul(randpoly(v, degree=100, dense), v=[x,y,z])):
```

# New multiplication and factorization benchmark.

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Times in seconds

multiply	Maple 16		Maple 17		Magma	Singular
	1 core	4 cores	1 core	4 cores	2.16-8	3.1
$p_1 := f_1(f_1 + 1)$	0.053	0.029	0.047	0.017	0.30	0.58
$p_3 := f_3(f_3 + 1)$	0.422	0.167	0.443	0.132	4.09	6.96
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More benchmarks and details available in preprint.

# Profile for factor(p1);

Profile for factor(p1); Real time from 2.63s to 1.11s real.

function	#calls	Maple 16		New Maple	
		time	time%	time	time%
coeftayl	216	0.999s	36.96	0.270s	22.39
expand	1934	0.561s	20.75	0.375s	31.09
factor/diophant	236	0.475s	17.57	0.371s	30.76
divide	419	0.267s	9.88	0.055s	4.56
factor	1	0.206s	7.62	0.017s	1.41
factor/hensel	1	0.140s	5.18	0.075s	6.22
factor/unifactor	2	0.055s	2.03	0.043s	3.57
total:	2809	2.703s	100.00%	1.206s	100.00%

The `coeftayl(f,x=a,k);` command is defined by  
`coeff(taylor(f,x=a,k+1),x,k);` and is computed via  
`eval(diff(f,x$k),x=a) / k!` which is 4x faster.

# Notes on the new integration for Maple 17.

Let  $f \in R[x_1, x_2, \dots, x_n]$  with  $\deg_{x_i} f > 0$ . We store  $f$  using POLY if

- (i)  $f$  has integer coefficients
- (ii)  $d > 1$  and  $t > 1$  where  $d = \deg f$  and  $t = \# \text{terms}$ .
- (iii) we can pack all monomials of  $f$  into one 64 bit word, i.e. if  $d < 2^b$  where  $b = \lfloor \frac{64}{n+1} \rfloor$

Otherwise we use the old sum-of-products representation.

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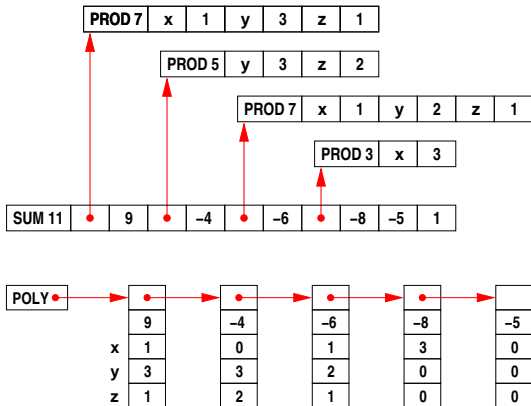
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- Packing is fixed by  $n = \# \text{variables}$ .
- If  $n = 8$ , (iii)  $\implies$  we use  $b = \lfloor 64/9 \rfloor = 7$  bits per exponent field hence POLY restricts  $d < 128$ .
- The representation is invisible to the Maple user. Conversions are automatic.
- POLY polynomials will be displayed in sorted order.

# Conclusion

We will not get good parallel speedup using these



Thank you for attending my talk.