

# Parallel Sparse Polynomial Multiplication Using Heaps Roman Pearce Michael Monagan

# Multicore Processors



The AMD Phenom II is an entry level CPU in 2009. It has four cores (left), each with 512KB L2 cache, and a 6 MB L3 cache (right) which can be used for communication between the cores.

Most programs do not benefit from additional cores.

# Sparse Polynomials

Computer algebra systems like Maple spend a lot of time multiplying and dividing polynomials. E.g.:

$$f = 9xy^{3}z - 4y^{3}z^{2} - 6xy^{2}z - 8x^{3} - 5x^{3}y^{2} + 2xyz^{3} - 3y^{2}z^{2} + 7xy + 1$$

The polynomials are often stored in a *sparse format* which represents only non-zero terms.

To compute  $f \times g$  we multiply each term of f by all the terms of g, sort the products, and add like terms.

Doubling the size of f and g quadruples the time or worse. A lot of time is spent doing large problems.

Even seemingly unrelated tasks like integration use sparse polynomial routines. Their speed is critical.

So how fast can we multiply sparse polynomials?





#### Multiplication Using a Heap

The key to high performance is the CPU cache. Main memory is slow. Johnson's algorithm uses a heap to simultaneously merge each  $f_i \times g$ . The first term of each  $f_i \times g$  is put into a heap, from which we extract terms in descending order. When  $f_i \times g_j$  is extracted from the heap it is added to the end of the result and we insert  $f_i \times g_{i+1}$  if it exists.



The heap is O(#f) so it fits in the CPU cache. Inserting and extracting terms is  $O(\log \# f)$  monomial comparisons. We do at most  $O(\#f \#g \log \#f)$  comparisons in total.

### Parallel Algorithm

- Each thread uses a local heap to multiply some of the  $f_i \times g$ .
- Intermediate results are written to buffers in shared L3 cache.
- The threads take turns combining the buffers to form the result.



$$+ g_{2} + g_{3} + \dots + g_{\#g}) + g_{2} + g_{3} + \dots + g_{\#g}) + g_{2} + g_{3} + \dots + g_{\#g}) \vdots + g_{2} + g_{3} + \dots + g_{\#g})$$

## Parallel Performance

We multiplied random univariate polynomials with 8192 terms. Typical problems run 5x faster with 4 cores on a Core i7 CPU.



$f = (1 + x + y + z + t)^{30}$ $g = f + 1$					
$46376 \times 46376 = 635376$ terms $W(f,g) = 3332$					
threads		Core i7		Core 2 Quad	
	4	11.48 s	6.15x	14.15 s	4.25x
our software	3	16.63 s	4.24x	19.43 s	3.10x
(sdmp)	2	28.26 s	2.50x	28.29 s	2.13x
	1	70.59 s		60.25 s	
Magma 2.15-8	1	526.12 s			
Pari/GP 2.3.3	1	642.74 s		707.61 s	
Singular 3-1-0	1	744.00 s		1048.00 s	
Maple 13	1	5849.48 s		9343.68 s	

[1] Stephen C. Johnson. Sparse Polynomial Arithmetic. ACM SIGSAM Bulletin, Volume 8, Issue 3 (1974) 63–71.

[2] Michael Monagan, Roman Pearce. Parallel Sparse Polynomial Multiplication Using Heaps. *Proceedings of ISSAC 2009*.

The speedup is relative to the fastest sequential code available. Our code is 50x faster than other computer algebra systems.