# Writing Shared Memory Parallel Programs in Ada multitasked Newton's method for power series

#### Jan Verschelde

University of Illinois at Chicago Department of Mathematics, Statistics, and Computer Science http://www.math.uic.edu/~jan janv@uic.edu

#### www.phcpack.org

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# Outline



#### Introduction

- motivation and problem statement
- Newton's method to compute power series expansions
- multithreading on multicore processors

#### Multitasking in Ada

- Iaunching a crew of workers
- writing multitasked code
- evaluation and differentiation at power series
- a linear block triangular system

#### **Computational Results**

wall clock times and speedup

## motivation: approximation of space curves

Viviani's curve is a space curve defined by

$$\mathbf{f} = (x_1^2 + x_2^2 + x_3^2 - 4, (x_1 - 1)^2 + x_2^2 - 1).$$

At the point (0, 0, 2), consider power series expansions:



Increased degrees of truncation give better approximations.

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Shared Memory Parallel Programs

## Newton's method

We compute  $\mathbf{x}(t)$  a power series solution to  $\mathbf{f}(\mathbf{x}) = \mathbf{0}$ , starting at a point  $\mathbf{x}(0) = \mathbf{z}$ ,  $\mathbf{x}(t) = \mathbf{z} + \mathbf{x}_1 t + \mathbf{x}_2 t^2 + \cdots$ .

Let  $J_{\mathbf{f}}$  be the matrix of all partial derivatives of  $\mathbf{f}$ , we compute the update  $\Delta \mathbf{x}(t)$  to  $\mathbf{x}(t)$  as the solution of a linear system

$$J_{\mathbf{f}}(\mathbf{x}(t))\Delta\mathbf{x}(t) = -\mathbf{f}(\mathbf{x}(t)),$$

and then do  $\mathbf{x}(t) := \mathbf{x}(t) + \Delta \mathbf{x}(t)$ .

Computational difficulties:

- increasing number of equations and variables,
- Iruncate the power series at increasing degrees,
- Image: multiprecision arithmetic needed for roundoff errors.

Goal: improve the efficiency by parallel computations.

## multithreading on multicore processors

All computers have multicore processors.

Development on three different computers and operating systems:

- Linux Microway workstation with two 22-core procesors. Two 22-core 2.2 GHz Intel Xeon E5-2699, 256 GB RAM.
- Windows MSI laptop with one 8-core processor. Intel Core i9-9880H 2.30 GHz, 32 GB RAM.
- MacOS X MacBook Pro laptop, with dual core processor. Intel Core i7 3.10 GHz processor, 16 GB RAM.

On these three above computers, best speedups are achieved with respectively 88, 16, and 4 threads.

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#### starting worker tasks

procedure Workers is instantiated with a Job procedure, executing code based on the id number.

```
procedure Workers ( n : in natural ) is
   task type Worker ( id,n : natural );
   task body Worker is
   begin
     Job(id,n);
   end Worker;
   procedure Launch Workers ( i,n : in natural ) is
     w : Worker(i,n);
   begin
     if i < n
      then Launch Workers (i+1, n);
     end if;
   end Launch Workers;
begin
   Launch Workers(1,n);
end Workers;
```

## writing multitasked code

We consider memory and granularity when writing multitasked code.

memory

Threads each have a stack, all share the same heap.

Auxiliary vectors in a computation

- should not be local variables in a function or procedure,
- are work space data attributes.

To avoid race conditions, different tasks work on different data.

granularity

The parallel code defines how jobs are mapped to tasks.

- Decide on the size of the jobs.
- A directed acyclic graph defines the order of jobs.
- Synchronize with relaunching tasks.
- there are always other issues ...

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## evaluation and differentiation at power series

For example, evaluate  $f = x_1 x_2 x_3 x_4 x_5$ , and compute all its partial derivatives, in three stages:

1) compute forward products :  $X_1 X_2 = X_1 \star X_2$  $X_1 X_2 X_3 = X_1 X_2 \star X_3$  $X_1 X_2 X_3 X_4 = X_1 X_2 X_3 \star X_4$  $X_1 X_2 X_3 X_4 X_5 = X_1 X_2 X_3 X_4 \star X_5$ 2) compute backward products :  $X_5 X_4 = X_5 \star X_4$  $X_5 X_4 X_3 = X_5 X_4 \star X_3$  $X_5 X_4 X_3 X_2 = X_5 X_4 X_3 \star X_2$ 3) compute cross products :  $X_1 X_3 X_4 X_5 = X_1 \star X_5 X_4 X_3$  $X_1 X_2 X_4 X_5 = X_1 X_2 \star X_5 X_4$  $X_1 X_2 X_3 X_5 = X_1 X_2 X_3 \star X_5$ 

Every  $\star$  is a multiplication of truncated power series.

Every monomial can be evaluated and differentiated independently of every other monomial  $\Rightarrow$  straightforward parallelism.

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#### a linear block triangular system

After evaluation and differentiation, we solve  $J_{\mathbf{f}}(\mathbf{x}(t))\Delta\mathbf{x}(t) = -\mathbf{f}(\mathbf{x}(t))$ . For example, if we truncate power series at degree 2:

$$\left(\boldsymbol{A}_{0}+\boldsymbol{A}_{1}t+\boldsymbol{A}_{2}t^{2}\right)\left(\Delta\boldsymbol{x}_{0}+\Delta\boldsymbol{x}_{1}t+\Delta\boldsymbol{x}_{2}t^{2}\right)=\boldsymbol{b}_{0}+\boldsymbol{b}_{1}t+\boldsymbol{b}_{2}t^{2},$$

then in matrix notation, we obtain the block triangular linear system

$$\begin{bmatrix} A_0 & & \\ A_1 & A_0 & \\ A_2 & A_1 & A_0 \end{bmatrix} \begin{bmatrix} \Delta \mathbf{x}_0 \\ \Delta \mathbf{x}_1 \\ \Delta \mathbf{x}_2 \end{bmatrix} = \begin{bmatrix} \mathbf{b}_0 \\ \mathbf{b}_1 \\ \mathbf{b}_2 \end{bmatrix}$$

A coarse grained parallel algorithm applies pipelining.

If the degree of the truncated power series equals d, using more than d threads will not increase the speedup.

## wall clock times and speedup

Wall clock times and speedups are reported on a 10-dimensional system, developing a power series at one cyclic 10-root, a known benchmark.

Running at most 8 steps with Newton's method in quad double precision, for increasing number p of tasks and degree d of truncation:

	<i>d</i> = 16		d = 32		d = 64		d = 96	
р	seconds	speedup	seconds	speedup	seconds	speedup	seconds	speedup
1	1.109s		2.304s		20.957s		46.030s	
2	0.649s	1.708	1.376s	1.674	11.582s	1.810	25.491s	1.806
4	0.441s	2.514	0.863s	2.670	7.407s	2.829	16.150s	2.850
8	0.348s	3.186	0.677s	3.405	5.335s	3.928	11.709s	3.931
16	0.376s	2.948	0.727s	3.168	5.279s	3.970	11.684s	3.940

On Windows laptop, Intel Core i9-9880H 2.30 GHz, 8 cores, 32 GB RAM.

The code is available on github at https://github.com/janverschelde/PHCpack/
in the folder src/Ada/Tasking.