

# Toward a Polynomial Model, Season III

## Polynomial Code Generation

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# Polynomials Everywhere

- ▶ The polyhedral model deals only with affine forms i.e. polynomials of degree one.
- ▶ Polynomials are needed:
  - ▶ If present in the source e.g. when computing distances
  - ▶ After evaluation of induction variables
  - ▶ After linearization of arrays
  - ▶ When counting messages, operations, memory cells ....

# Mathematical Background

Needed: an equivalent of Farkas lemma for building positivity certificates.

- ▶ Semi-algebraic sets:

$$S = \{x \in R^n \mid p_i(z) \geq 0, i = 1, n\}$$

where the  $p_i$  are polynomials.

- ▶ Theorems by Handelman, Schweighofer, Putinar:
- ▶ Schweighofer products:

$$g_\alpha(x) = p_1(x)^{\alpha_1} \dots p_n(x)^{\alpha_n}.$$

- ▶  $P(x)$  is strictly positive in  $S$  iff it is a positive linear combination of Schweighofer products
- ▶ Minor conditions:  $S$  must be compact and the  $g_i$  must generate all polynomials.
- ▶ Note that there is no integral version of these theorems.

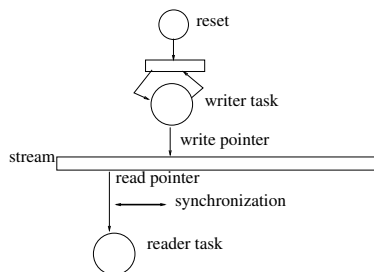
# Mechanics

Expand the master equation:

$$P(x) = \sum_{\alpha} \lambda_{\alpha} g_{\alpha}, \quad \lambda_{\alpha} \geq 0,$$

- ▶ Equate coefficients of like monomials
- ▶ The result is a linear system of equations in the  $\lambda$ s to be solved in positive unknowns by any linear program solver.
- ▶ Linear solvers are very powerful and can tackle problems with thousands of constraints and unknowns.
- ▶ Since one must limit the number of Schweighofer products, the problem is only semi-decidable.

# The OpenStream Language



```
stream s, t;
task reset{
    write once into s; //theta() = 0
}

for(i=0;;i++)
    task writer{ //theta(i) = i+1
        read once from s;
        write once into s;
        write once into t;
    }

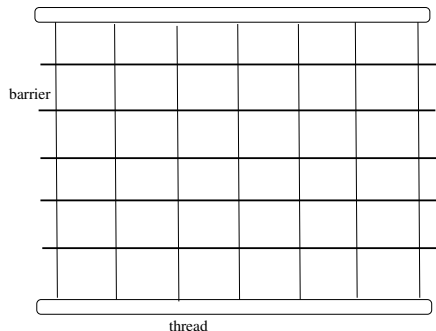
for(i=0;; i++)
    task reader{ //theta(i) = i+2
        read once from t;
    }
```

- ▶ A stream is a potentially infinite one dimensional array, with a write pointer and a read pointer.
- ▶ At each read or write, the corresponding pointer is increased by a non negative amount, the *burst*.
- ▶ The read pointer cannot overtake the write pointer : synchronization.
- ▶ Analogy with Unix files and hardware channels.

# Dependences and Scheduling

- ▶ If the control program is polyhedral, one can obtain closed form formulas for pointers by counting task creations using ISCC. The results are polynomials, hence the dependence relation is semi-algebraic.
- ▶ One can obtain polynomial schedules using Handelman or Schweighofer theorems.
- ▶ See IMPACT 2015, 2016.

# Code Generation Basics



- ▶ Each thread execute sequentially all instances of one task.
- ▶ After each instance, the thread execute some barriers.
- ▶ The number of barriers from the beginning of the stream to a given instance must be equal to the schedule of the instance.

# The Problem of the Decreasing Schedule

Since the number of barriers can only increase, task instances must be created in order of increasing schedule. Let  $\ll$  be the execution order of the control program, and  $\theta$  be the schedule of a task.

- ▶ If the system of constraints

$$u \ll v, \theta(v) < \theta(u)$$

is unfeasible, the schedule is increasing.

- ▶ If

$$u \ll v, \theta(u) < \theta(v),$$

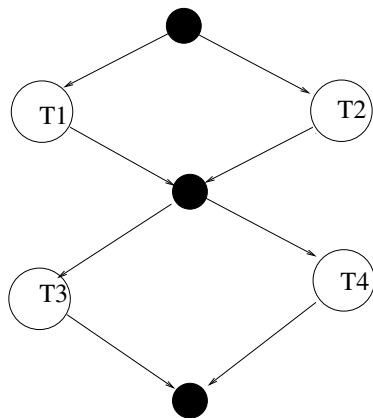
is unfeasible, the schedule is decreasing, the execution order must be reversed.

- ▶ If both systems are feasible, the schedule is non monotonic.  
Index set splitting?
- ▶ If both system are unfeasible, the schedule is constant.



## Target Languages: X10 / Habanero

```
clocked finish{  
  clocked async{  
    T1;  
  }  
  clocked async{  
    T2;  
  }  
  clocked async{  
    advance;  
    T3;  
  }  
  clocked async{  
    advance;  
    T4;  
  }  
}
```



## Related Work

- ▶ Counting Algorithms: Barvinok, Brion, Clauss and the Strasburg school, Ehrhart, Verdoolaege. Note that to the best of my knowledge, there is no equivalent for semi-algebraic sets.
- ▶ Delinearization, CART, CRP: avoiding polynomials.
- ▶ Achtziger and Zimmerman on quadratic schedules.
- ▶ Groesslinger on cylindrical algebraic decomposition.
- ▶ Clauss et. al. on inverting schedules.

# Conclusion and Future Work

- ▶ An implementation is under way.
- ▶ Needs to be extended: data parallelism, non monotonic schedules, task body.
- ▶ OpenStream is an interesting language: hiding non polyhedral code in the task body, HLS.
- ▶ A small step beyond the polyhedral model
- ▶ Missing tools:
  - ▶ A projection algorithm (CAD ?) and a transitive closure algorithm
  - ▶ A counting algorithm
  - ▶ A polynomial version of the Cousot-Halbwachs algorithm.
- ▶ Other Models ??