



William Thies, Michal Karczmarek, Janis Sermulins, Rodric Rabbah and Saman Amarasinghe

Massachusetts Institute of Technology PPoPP 2005

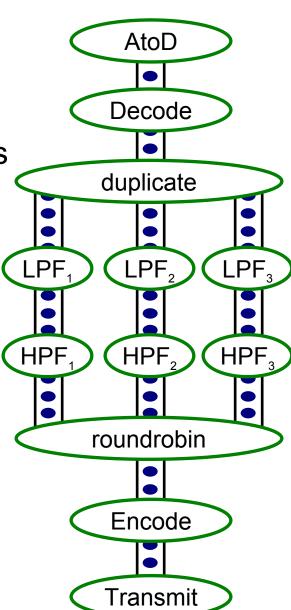




# **Streaming Application Domain**

- Based on a stream of data
  - Radar tracking, microphone arrays,
     HDTV editing, cell phone base stations
  - Graphics, multimedia, software radio
- Properties of stream programs
  - Regular and repeating computation
  - Parallel, independent actors with explicit communication
  - Data items have short lifetimes
- Amenable to aggressive compiler optimization

[ASPLOS '02, PLDI '03, LCTES'03, LCTES '05]

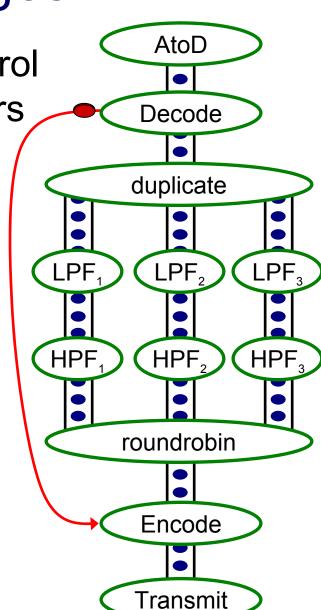




# **Control Messages**

Occasionally, low-bandwidth control messages are sent between actors

- Often demands precise timing
  - Communications: adjust protocol, amplification, compression
  - Network router: cancel invalid packet
  - Adaptive beamformer: track a target
  - Respond to user input, runtime errors
  - Frequency hopping radio
- What is the right programming model?
- ➡ How to implement efficiently?





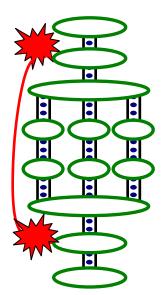
# **Supporting Control Messages**

Option 1: Synchronous method call

PRO: - delivery transparent to user

CON: - timing is unclear

- limits parallelism



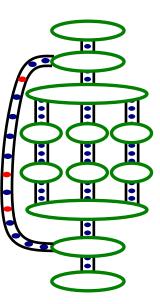
Option 2: Embed message in stream

PRO: - message arrives with data

**CON:** - complicates filter code

- complicates stream graph

- runtime overhead





# **Teleport Messaging**

 Looks like method call, but timed relative to data in the stream

```
TargetFilter x;
if newProtocol(p) {
 x.setProtocol(p) @ 2;
void setProtocol(int p) {
 reconfig(p);
```

PRO:

- simple and precise for user
  - adjustable latency
  - can send upstream or downstream
- exposes dependences to compiler



### **Outline**

- StreamIt
- Teleport Messaging
- Case Study
- Related Work and Conclusion



### **Outline**

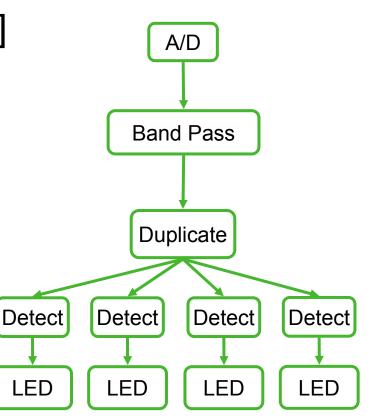
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# Model of Computation

- Synchronous Dataflow [Lee 92]
  - Graph of autonomous filters
  - Communicate via FIFO channels
  - Static I/O rates

- Compiler decides on an order of execution (schedule)
  - Many legal schedules







## Example StreamIt Filter

```
float->float filter LowPassFilter (int N, float[N] weights) {
  work peek N push 1 pop 1 {
     float result = 0;
     for (int i=0; i<weights.length; i++) {</pre>
        result += weights[i] * peek(i);
     push(result);
     pop();
                                                                filter
```



## **Example StreamIt Filter**

```
float->float filter LowPassFilter (int N, float[N] weights) {
  work peek N push 1 pop 1 {
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        result += weights[i] * peek(i);
     push(result);
     pop();
                                                              filter
   handler setWeights(float[N] _weights) {
     weights = _weights;
```



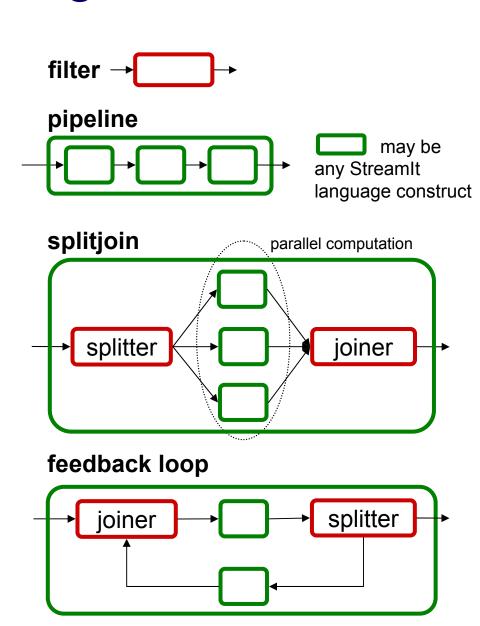
# **Example StreamIt Filter**

```
float->float filter LowPassFilter (int N, float[N] weights, Frontend f ) {
  work peek N push 1 pop 1 {
     float result = 0;
     for (int i=0; i<weights.length; i++) {</pre>
        result += weights[i] * peek(i);
      if (result == 0) {
        f.increaseGain() @ [2:5];
                                                               filter
      push(result);
      pop();
   handler setWeights(float[N] _weights) {
      weights = _weights;
```



# StreamIt Language Overview

- StreamIt is a novel language for streaming
  - Exposes parallelism and communication
  - Architecture independent
  - Modular and composable
    - Simple structures composed to creates complex graphs
  - Malleable
    - Change program behavior with small modifications





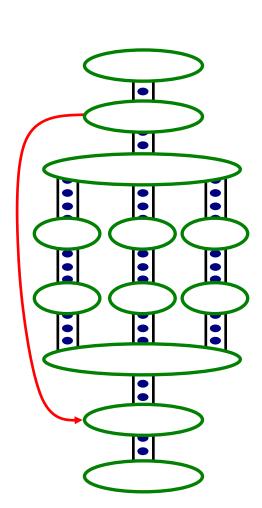
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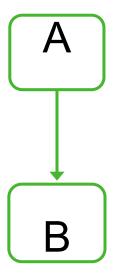
## Providing a Common Timeframe

- Control messages need precise timing with respect to data stream
- However, there is no global clock in distributed systems
  - Filters execute independently, whenever input is available
- Idea: define message timing with respect to data dependences
  - Must be robust to multiple datarates
  - Must be robust to splitting, joining



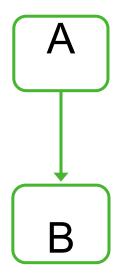


Describes data dependences between filters



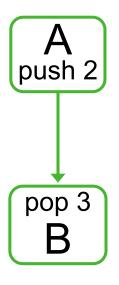


Describes data dependences between filters





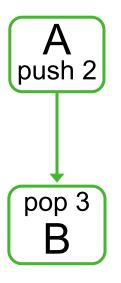
Describes data dependences between filters



n	SDEP <sub>A←B</sub> (n)
0	
1	
2	



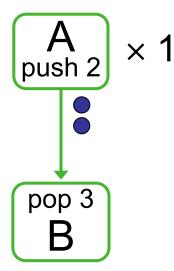
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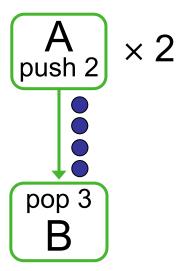
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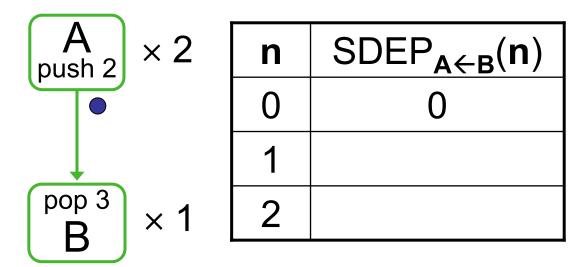
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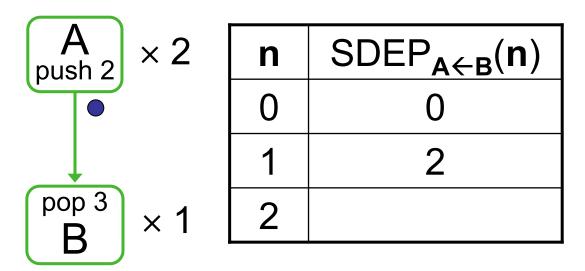


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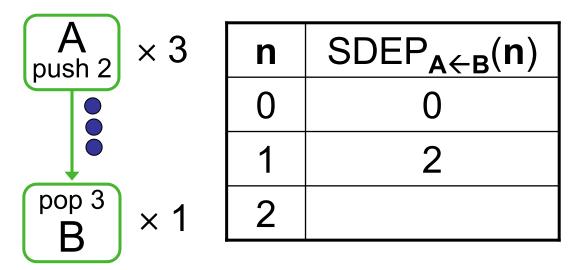
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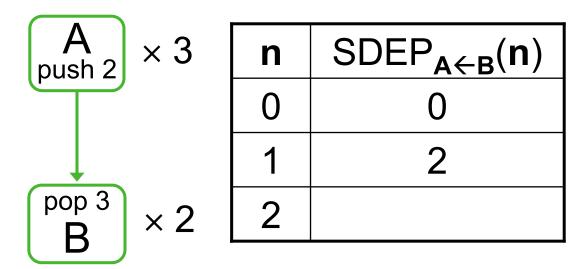
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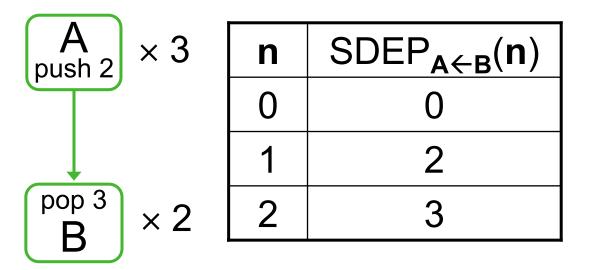
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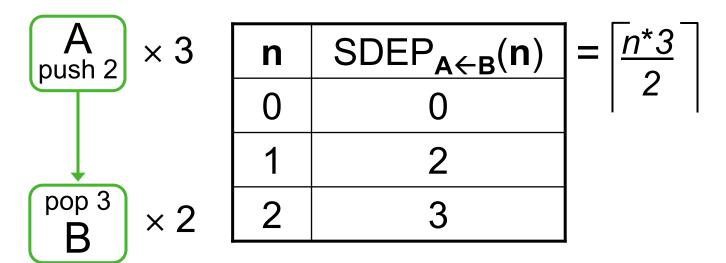


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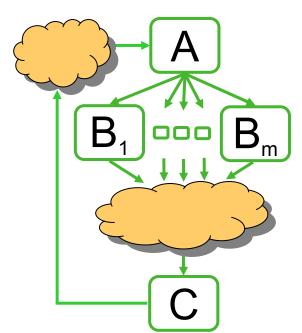


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## Calculating SDEP: General Case



$$SDEP_{A \leftarrow C}(n) = \max_{i \in [1,m]} [SDEP_{A \leftarrow Bi}(SDEP_{Bi \leftarrow C}(n))]$$

⇒ SDEP is compositional

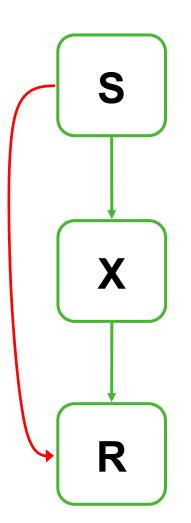


 SDEP provides precise semantics for message timing

### If **S** sends message to **R**:

- on the nth execution of S
- with latency range [k<sub>1</sub>, k<sub>2</sub>]

Then message is delivered to **R**:



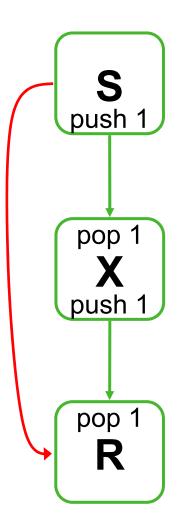


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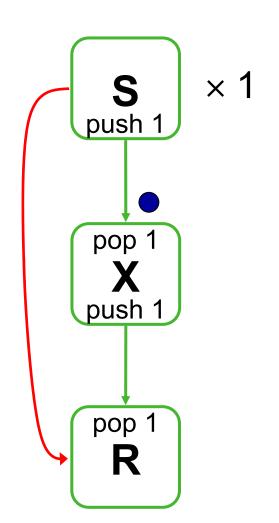
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 on any iteration m such that  $n+k_1 \leq SDEP_{S \leftarrow R}(m) \leq n+k_2$ 



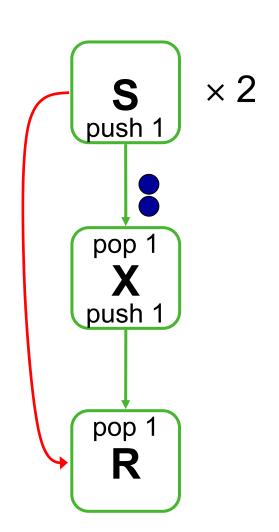


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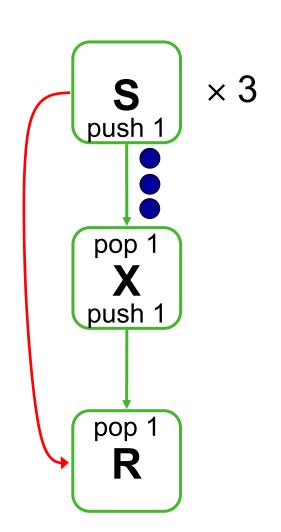


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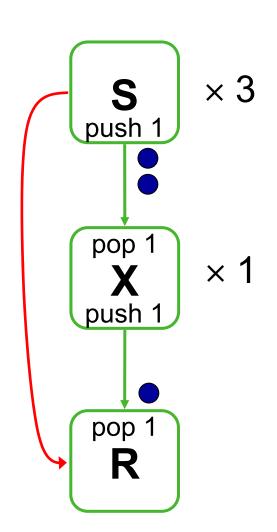


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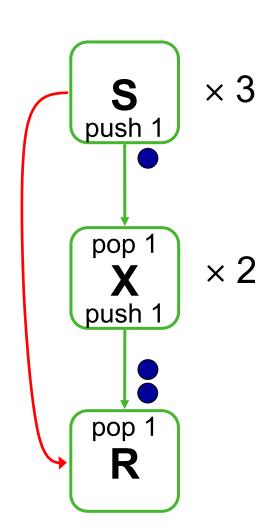


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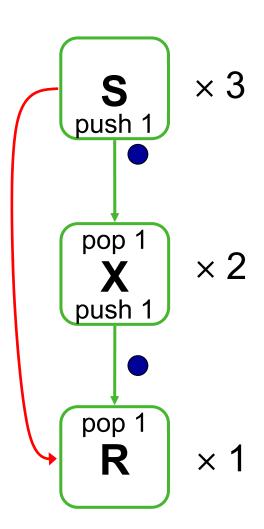


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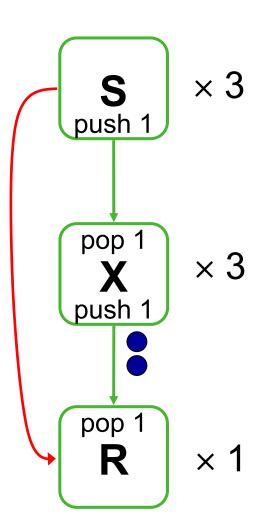


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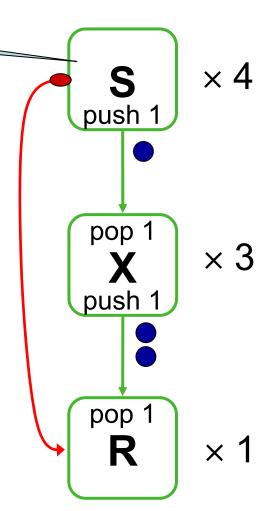
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#### If **S** sends message to **R**:

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on any iteration m such that
 n+k<sub>1</sub> ≤ SDEP<sub>S←R</sub>(m) ≤ n+k<sub>2</sub>





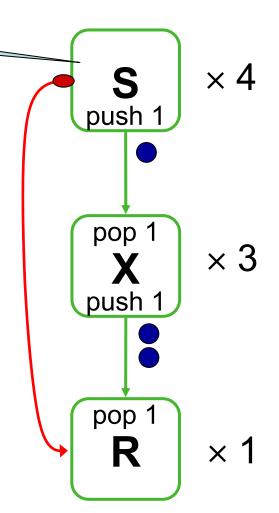
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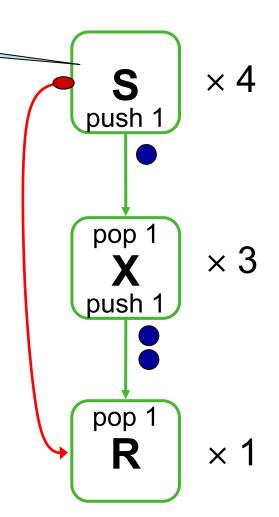
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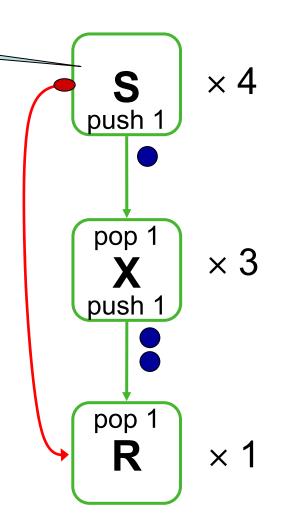
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$$4+0 \leq SDEP_{S \leftarrow R}(m) \leq 4+0$$





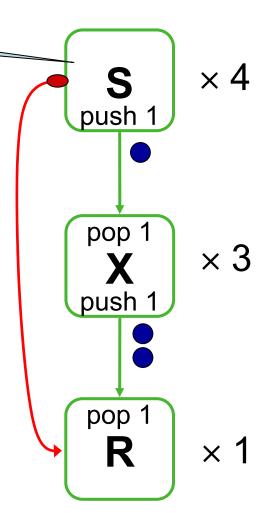
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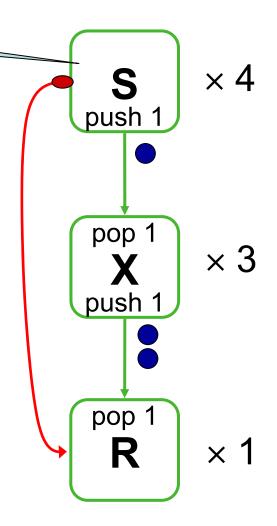
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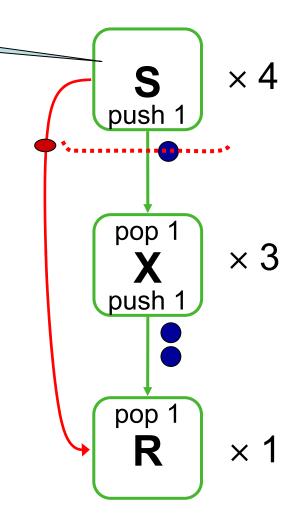
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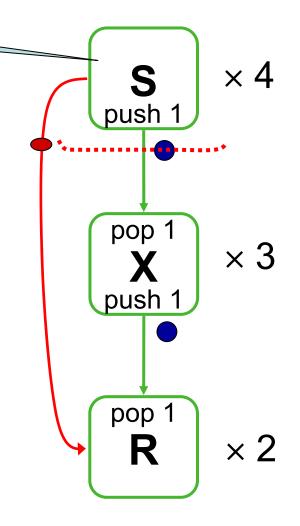
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$$4+0 \le SDEP_{S \leftarrow R}(m) \le 4+0$$

$$SDEP_{S \leftarrow R}(m) = 4$$

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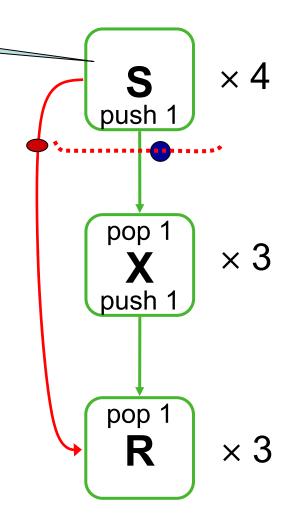
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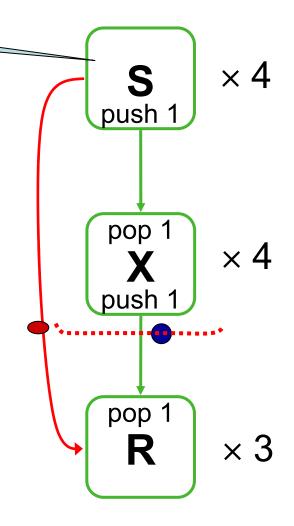
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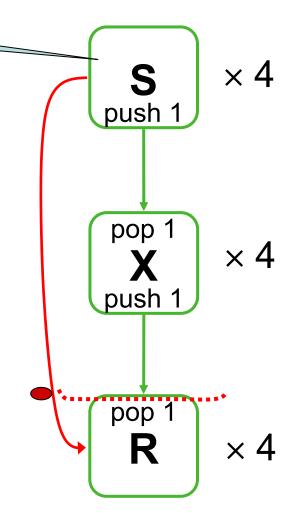
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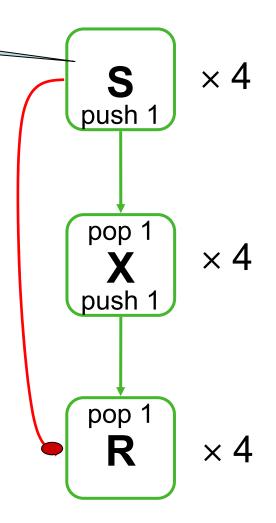
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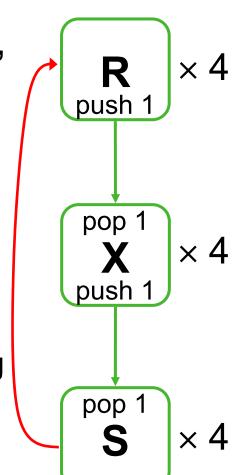
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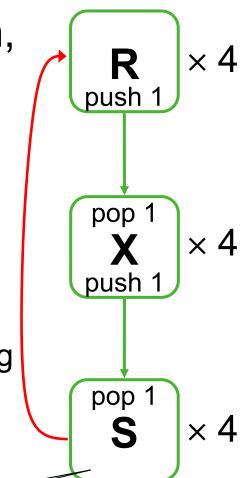


- If embedding messages in stream, must send in direction of dataflow
- Teleport messaging provides provides a unified abstraction
- Intuition:
  - If S sends to R with latency k
  - Then R receives message when producing item that **S** sees in **k** of its own time steps



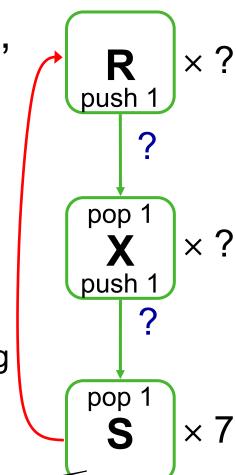


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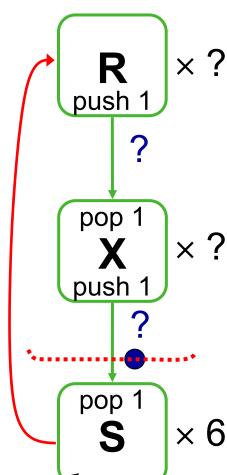
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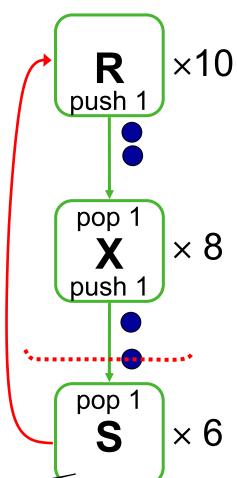


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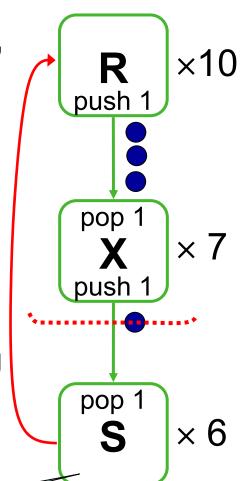
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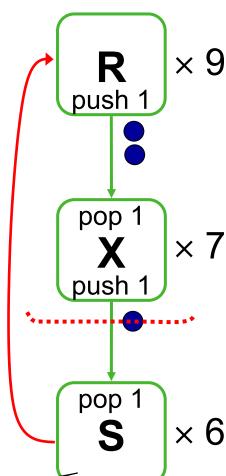


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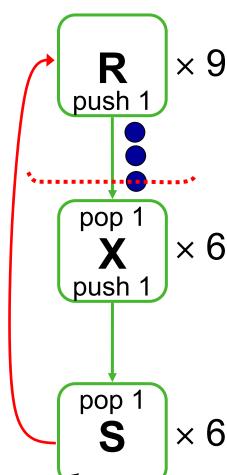


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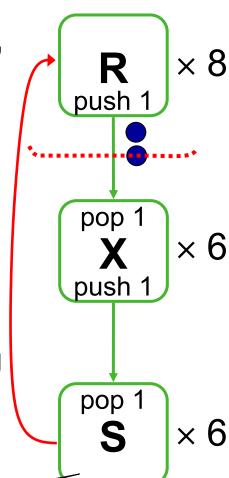


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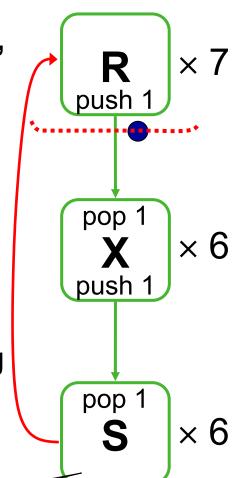


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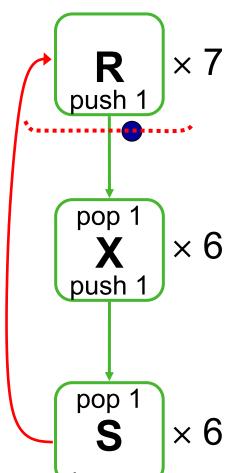


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- Teleport messaging provides provides a unified abstraction
- Intuition:
  - If S sends to R with latency k
  - Then R receives message when producing item that S sees in k of its own time steps
  - R receives message on iteration 7







	latency < 0	latency = 0	latency > 0
Message travels upstream			
Message travels downstream			



	latency < 0	latency = 0	latency > 0
Message travels upstream			Must not buffer too much data
Message travels downstream			



	latency < 0	latency = 0	latency > 0
Message travels upstream	Illegal	Illegal	Must not buffer too much data
Message travels downstream			



	latency < 0	latency = 0	latency > 0
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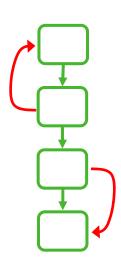


	latency < 0	latency = 0	latency > 0
Message travels upstream	Illegal	Illegal	Must not buffer too much data
Message travels downstream	Must not buffer too little data	No constraint	No constraint

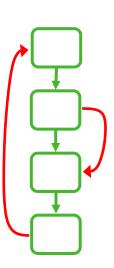


# Finding a Schedule

 Non-overlapping messages: greedy scheduling algorithm



- Overlapping messages: future work
  - Overlapping constraints
     can be feasible in isolation,
     but infeasible in combination





## **Outline**

- StreamIt
- Teleport Messaging
- Case Study
- Related Work and Conclusion



# Frequency Hopping Radio

AtoD

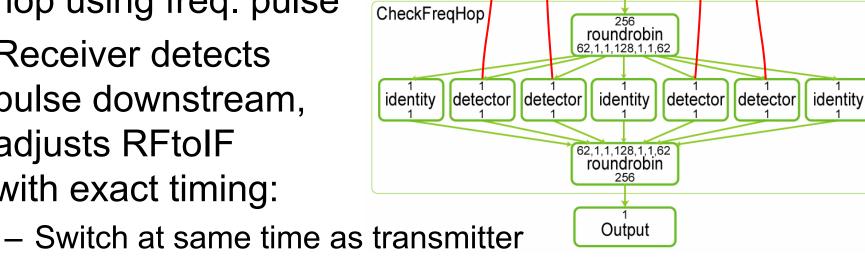
**RFtoIF** 

512

FFT

Magnitude

- Transmitter and receiver switch between set of known frequencies
- Transmitter indicates timing and target of hop using freq. pulse
- Receiver detects pulse downstream, adjusts RFtoIF with exact timing:



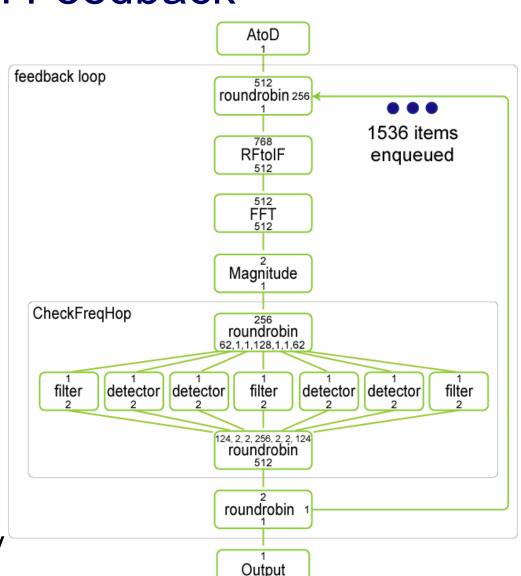
Switch at FFT frame boundary



# Frequency Hopping Radio: Manual Feedback

CSAI

- Introduce feedback loop with dummy items to indicate presence or absence of message
- To add latency, enqueue
   1536 initial items on loop
- Extra changes needed along path of message
  - Interleave messages, data
  - Route messages to loop
  - Adjust I/O rates
- To respect FFT frames, change RFtoIF granularity





# Frequency Hopping Radio: Teleport Messaging

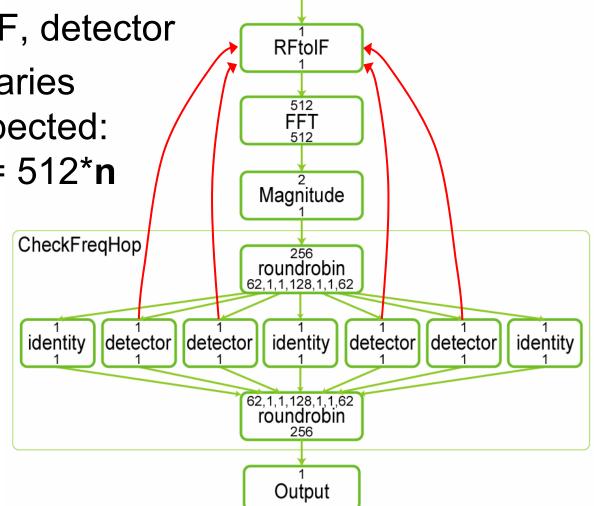


Use message latency of 6

Modify only RFtoIF, detector

 FFT frame boundaries automatically respected: SDEP<sub>RFIF←det</sub>(n) = 512\*n

■ Teleport messaging improves programmability



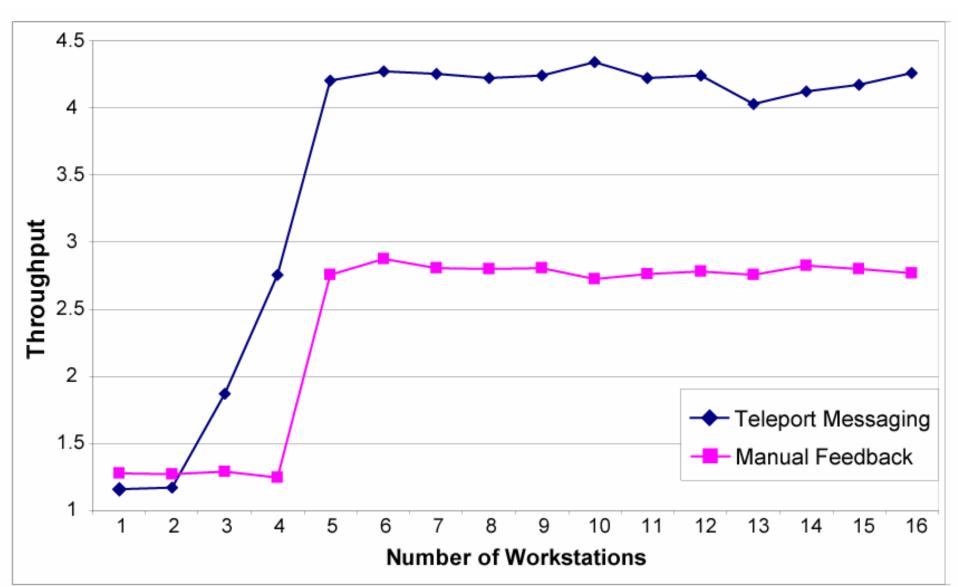
**AtoD** 





# **Preliminary Results**







## **Outline**

- StreamIt
- Teleport Messaging
- Case Study
- Related Work and Conclusion

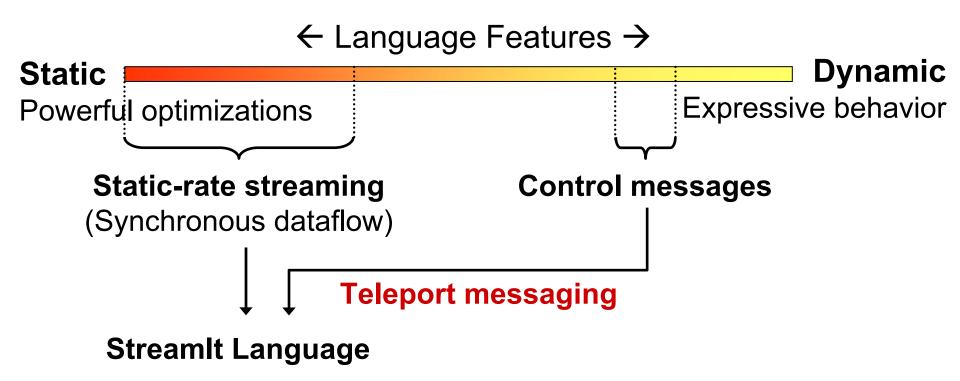


## Related Work

- Heterogeneous systems modeling
  - Ptolemy project (Lee et al.); scheduling (Bhattacharyya, ...)
  - Boolean dataflow: parameterized data rates
  - Teleport messaging allows complete static scheduling
- Program slicing
  - Many researchers; see Tip'95 for survey
  - Like SDEP, find set of dependent operations
  - SDEP is more specialized; can calculate exactly
- Streaming languages
  - Brook, Cg, StreamC/KernelC, Spidle, Occam, Sisal,
     Parallel Haskell, Lustre, Esterel, Lucid Synchrone
  - Our goal: adding restricted dynamism to static language



### Conclusion



- Teleport messaging provides precise and flexible event handling while allowing static optimizations
  - Data dependences (SDEP) is natural timing mechanism
  - Messaging exposes true communication to compiler



### Extra Slides



### Calculating SDEP in Practice

Direct SDEP formulation:

$$SDEP_{\mathbf{A}\leftarrow\mathbf{C}}(\mathbf{n}) = \max_{\mathbf{max}(0, \frac{n^*o_c - \overline{k}}{u_{b1}})^*o_{b1} - \overline{k}},$$

$$\max_{\mathbf{max}(0, \frac{n^*o_c - \overline{k}}{u_{b2}})^*o_{b2} - \overline{k}},$$

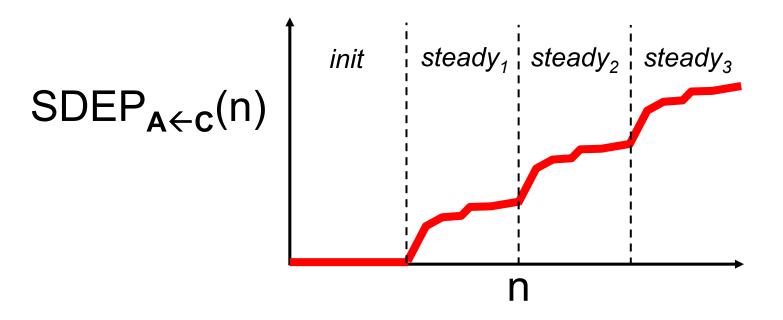
$$\max_{\mathbf{max}(0, \frac{n^*o_c - \overline{k}}{u_{b3}})^*o_{b3} - \overline{k}},$$

$$\max_{\mathbf{max}(0, \frac{n^*o_c - \overline{k}}{u_{b3}})^*o_{b3} - \overline{k}},$$

Direct calculation could grow unwieldy



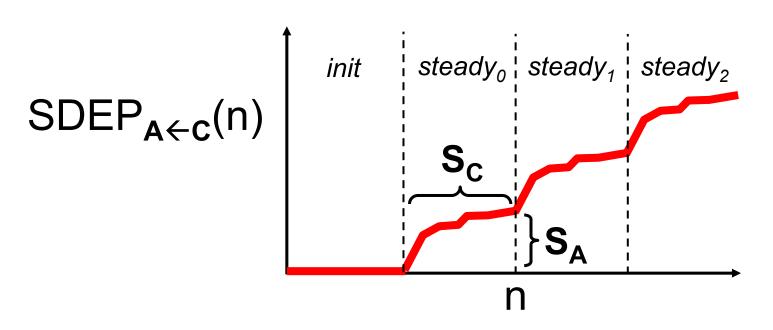
### Calculating SDEP in Practice



- initialization: consumes all initial items
- steady state: repetition of each actor that does not change number of items on channels



## Calculating SDEP in Practice



$$\begin{split} \text{SDEP(n)} = & \begin{cases} 0 & n \in \text{init} \\ \text{lookup\_table[n]} & n \in \text{steady}_0 \\ \text{k*S}_{\text{A}} + \text{SDEP(n-k*S}_{\text{C}}) & n \in \text{steady}_k \end{cases} \end{split}$$

➡ Build small SDEP table statically, use for all n



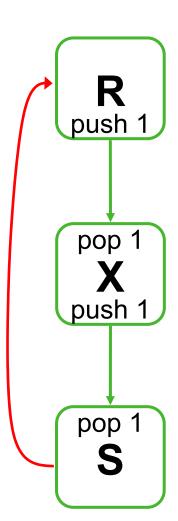
#### If **S** sends **upstream** message to **R**:

- with latency range [k<sub>1</sub>, k<sub>2</sub>]
- on the nth execution of S

Then message is delivered to **R**:

on any iteration m such that

$$SDEP_{R \leftarrow S}(n+k_1) \le m \le SDEP_{R \leftarrow S}(n+k_2)$$



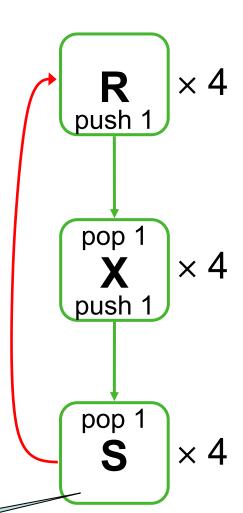
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Receiver r;

r.decimate() @ [3:3]

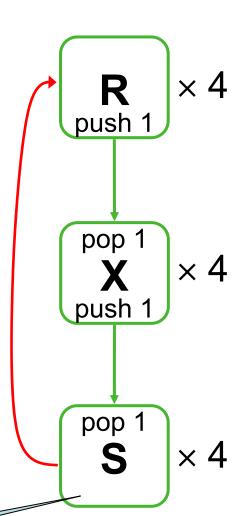
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Receiver r;

r.decimate() @ [3:3]



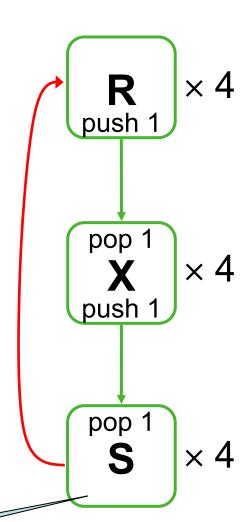
#### If **S** sends **upstream** message to **R**:

- with latency range [3, 3]
- on the 4th execution of S

Then message is delivered to **R**:

• on any iteration **m** such that

$$\mathsf{SDEP}_{\mathsf{R}\leftarrow\mathsf{S}}(\mathsf{n}+\mathsf{k}_1) \leq \mathsf{m} \leq \mathsf{SDEP}_{\mathsf{R}\leftarrow\mathsf{S}}(\mathsf{n}+\mathsf{k}_2)$$





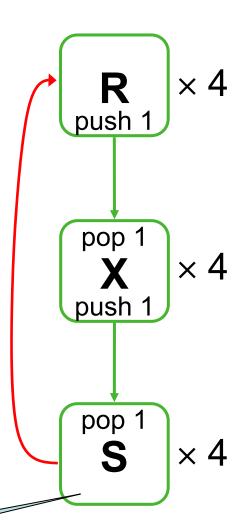
#### If S sends upstream message to R:

- with latency range [3, 3]
- on the 4th execution of S

Then message is delivered to **R**:

on any iteration m such that

$$SDEP_{R \leftarrow S}(4+3) \le m \le SDEP_{R \leftarrow S}(4+3)$$





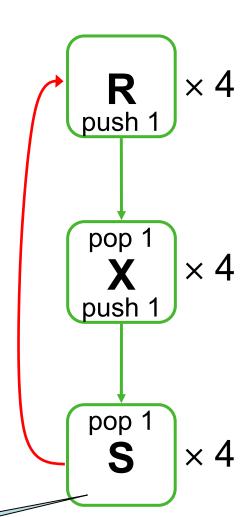
#### If **S** sends **upstream** message to **R**:

- with latency range [3, 3]
- on the 4th execution of S

#### Then message is delivered to **R**:

on any iteration m such that

$$SDEP_{R \leftarrow S}(4+3) \le m \le SDEP_{R \leftarrow S}(4+3)$$
  
 $m = SDEP_{R \leftarrow S}(7)$ 



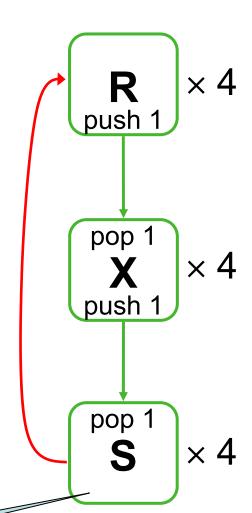
### If **S** sends **upstream** message to **R**:

- with latency range [3, 3]
- on the 4th execution of S

#### Then message is delivered to **R**:

• on any iteration **m** such that

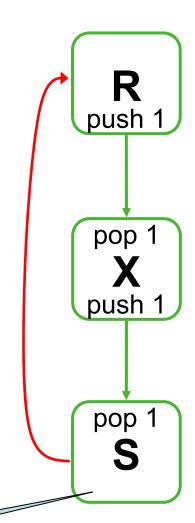
$$\begin{split} \mathsf{SDEP}_{\mathsf{R} \leftarrow \mathsf{S}}(\mathbf{4+3}) &\leq \mathsf{m} \leq \mathsf{SDEP}_{\mathsf{R} \leftarrow \mathsf{S}}(\mathbf{4+3}) \\ \mathsf{m} &= \mathsf{SDEP}_{\mathsf{R} \leftarrow \mathsf{S}}(\mathbf{7}) \\ \mathsf{m} &= \mathbf{7} \end{split}$$





### Constraints Imposed on Schedule

- If S sends on iteration n, then
   R receives on iteration n+3
  - Thus, if S is on iteration n, then
     R must not execute past n+3
  - Otherwise, R could miss message
  - Messages constrain the schedule
- If latency is 0 instead of 3, then no schedule satisfies constraint
  - Some latencies are infeasible





### Implementation

- Teleport messaging implemented in cluster backend of StreamIt compiler
  - SDEP calculated at compile-time, stored in table
- Message delivery uses "credit system"
  - Sender sends two types of packets to receiver:
    - 1. Credit: "execute n times before checking again."
    - 2. Message: "deliver this message at iteration m."
  - Frequency of credits depends on SDEP, latency range
  - Credits expose parallelism, reduce communication



### **Evaluation**

- Evaluation platform:
  - Cluster of 16 Pentium III's (750 Mhz)
  - Fully-switched 100 Mb network
- StreamIt cluster backend
  - Compile to set of parallel threads, expressed in C
  - Threads communicate via TCP/IP
  - Partitioning algorithm creates load-balanced threads