



## Dataflow modeling

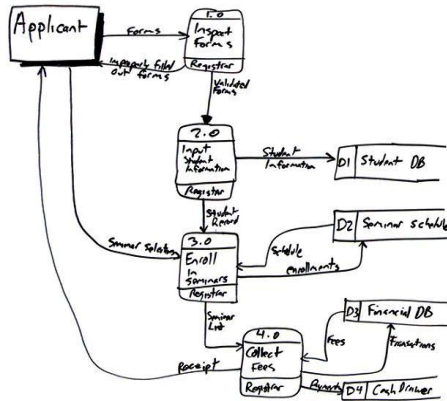
Lee/Seshia  
Section 6.3

Marwedel  
Section 2.5

- Identifying, modeling and documenting how data moves around an information system.
- Dataflow modeling examines
  - *processes* (activities that transform data from one form to another),
  - *data stores* (the holding areas for data),
  - *external entities* (what sends data into a system or receives data from a system, and
  - *data flows* (routes by which data can flow).
- Dataflow modeling focuses on *how things connect*, (imperative programming: *how things happen*).
- Scheduling responsibility of the system, not programmer

## Data flow modeling

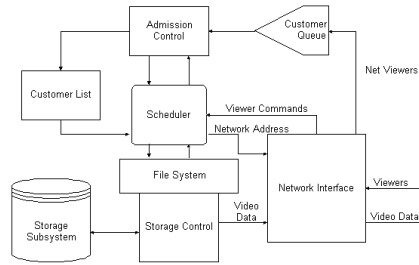
### Registering for courses



<http://www.agilemodeling.com/artifacts/dataFlowDiagram.htm>

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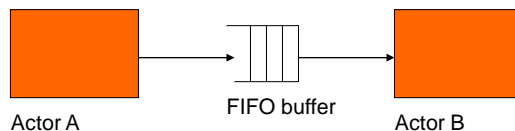
### Video on demand system



[www.ece.ubc.ca/~irenek/techpaps/vod/vod.html](http://www.ece.ubc.ca/~irenek/techpaps/vod/vod.html)

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## Dataflow models



Buffered communication between concurrent components (*actors*).

An actor can fire whenever it has enough data (*tokens*) in its input buffers. It then produces some data on its output buffers.

In principle, buffers are unbounded. But for implementation on a computer, we want them bounded (and as small as possible).

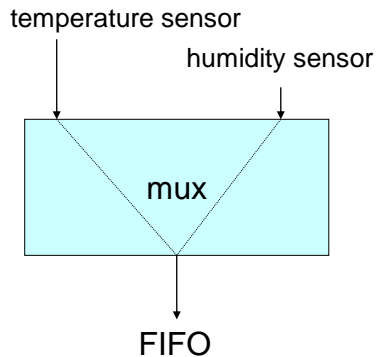
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## Process networks

Many applications can be specified in the form of a set of communicating processes.

**Example:** system with two sensors:



Alternating read

**loop**

```
read_temp; read_humidity  
until false;
```

of the two sensors  
not the right approach.

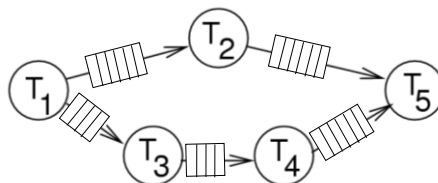
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## Reference model for dynamic data flow: Kahn process networks (1974)

Describe computations to be performed and their dependence  
but not the order in which they must be performed

communication via infinitely large FIFOs



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## Properties of Kahn process networks (1)

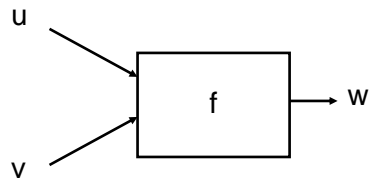
- Each node corresponds to one program/task;
- Communication is only via channels;
- Channels include FIFOs as large as needed;
- Channels transmit information within an unpredictable but finite amount of time;
- Mapping from  $\geq 1$  input sequence to  $\geq 1$  output sequence;
- In general, execution times are unknown;
- Send operations are non-blocking, reads are blocking.
- One producer and one consumer;  
i.e. there is only one sender per channel;

## Properties of Kahn process networks (2)

- There is only one sender per channel.
- A process cannot check whether data is available before attempting a read.
- A process cannot wait for data for more than one port at a time.
- Therefore, the order of reads depends only on data, not on the arrival time.
- Therefore, Kahn process networks are **deterministic (!)**; for a given input, the result will always be the same, regardless of the speed of the nodes.

## A Kahn Process

```
process f(in int u, in int v, out int w)
{
  int i; bool b = true;
  for (;;) {
    i = b ? wait(u) : wait(w);
    printf("%i\n", i);
    send(i, w);
    b = !b;
  }
}
```



Process alternately reads from u and v, prints the data value, and writes it to w

Source: Gilles Kahn, The Semantics of a Simple Language for Parallel Programming (1974)

## A Kahn Process

```
process f(in int u, in int v, out int w)
{
  int i; bool b = true;
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    printf("%i\n", i);
    send(i, w);
    b = !b;
  }
}
```

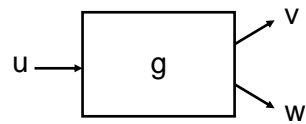
wait() returns the next token in an input FIFO, blocking if it's empty

send() writes a data value on an output FIFO

Source: Gilles Kahn, The Semantics of a Simple Language for Parallel Programming (1974)

## A Kahn Process

```
process g(in int u, out int v, out int w)
{
  int i; bool b = true;
  for(;;) {
    i = wait(u);
    if (b) send(i, v); else send(i, w);
    b = !b;
  }
}
```

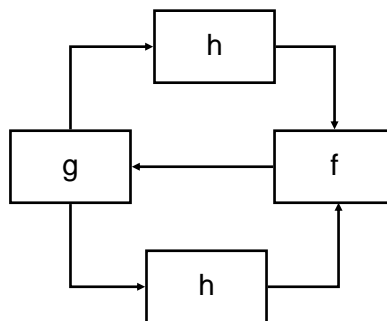


Process reads from u and alternately copies it to v and w

## A Kahn System

- Prints an alternating sequence of 0's and 1's

Emits a 1 then copies input to output



Emits a 0 then copies input to output

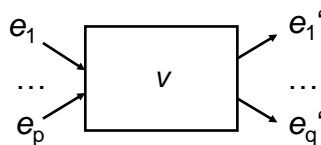
## Definition: Kahn networks

A **Kahn process network** is a directed graph  $(V, E)$ , where

- $V$  is a set of **processes**,
- $E \subseteq V \times V$  is a set of **edges**,
- associated with each edge  $e$  is a **domain**  $D_e$
- $D^\omega$ : finite or countably infinite sequences over  $D$

$D^\omega$  is a complete partial order where  
 $X \leq Y$  iff  $X$  is an initial segment of  $Y$

## Definition: Kahn networks



- associated with each process  $v \in V$  with incoming edges  $e_1, \dots, e_p$  and outgoing edges  $e_1', \dots, e_q'$  is a continuous **function**

$$f_v: D_{e_1}^\omega \times \dots \times D_{e_p}^\omega \rightarrow D_{e_1'}^\omega \times \dots \times D_{e_q'}^\omega$$

(A function  $f: A \rightarrow B$  is **continuous** if  $f(\lim_A a) = \lim_B f(a)$  )

## Semantics: Kahn networks

A process network defines for each edge  $e \in E$  a **unique** sequence  $X_e$ .

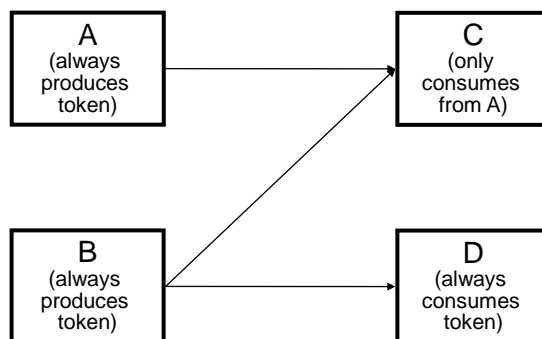
$X_e$  is the least fixed point of the equations

$$(X_{e_1'}, \dots, X_{e_q'}) = f_v(X_{e_1}, \dots, X_{e_q})$$

for all  $v \in V$ .

Result is independent of scheduling!

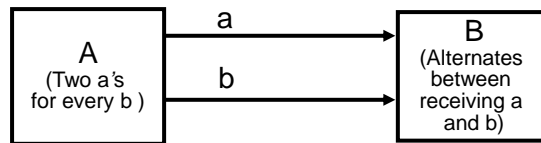
## Scheduling Kahn Networks



Problem: run processes with finite buffer



## Scheduling may be impossible



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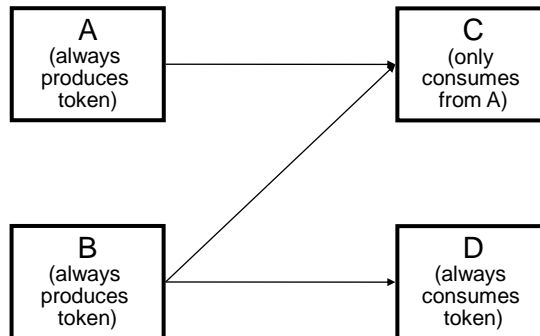
## Parks' Scheduling Algorithm (1995)

- Set a capacity on each channel
- Block a write if the channel is full
- Repeat
  - Run until deadlock occurs
  - If there are no blocking writes → terminate
  - Among the channels that block writes, select the channel with least capacity and increase capacity until producer can fire.

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## Example



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## Parks' Scheduling Algorithm

- Whether a Kahn network can execute in bounded memory is undecidable
- Parks' algorithm does not violate this
- It will run in bounded memory if possible, and use unbounded memory if necessary

### Disadvantages:

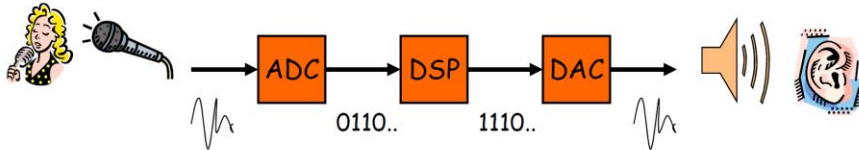
- Requires dynamic memory allocation
- Does not guarantee minimum memory usage
- Scheduling choices may affect memory usage
- Data-dependent decisions may affect memory usage
- Relatively costly scheduling technique
- Detecting deadlock may be difficult

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## Synchronous data flow

With digital signal processors, data flows at fixed rate

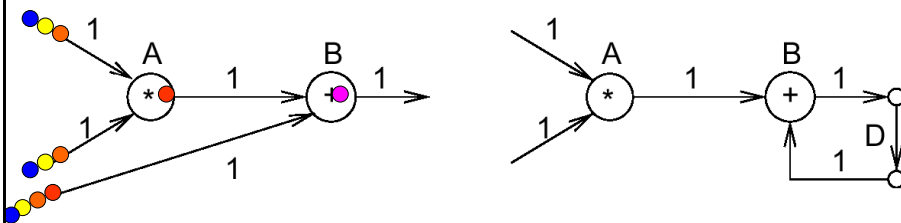


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## Synchronous data flow (SDF)

- Restriction of Kahn networks (Berkeley, Ptolemy system)
- Asynchronous message passing = tasks do not have to wait until output is accepted.
- Synchronous data flow = all tokens are consumed at the same time.



SDF model allows static scheduling of token production and consumption.

In the general case, buffers may be needed at edges.

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## SDF: restriction of Kahn networks

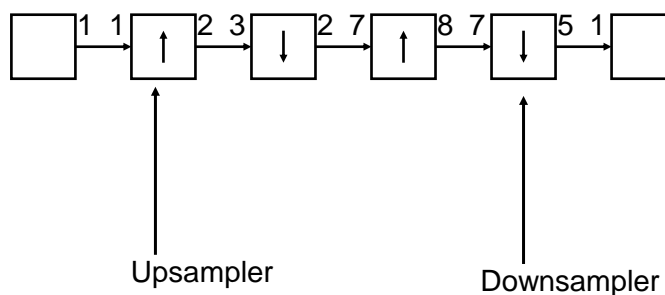
An **SDF graph** is a tuple  $(V, E, \text{cons}, \text{prod}, d)$  where

- $V$  is a set of nodes (activities)
- $E$  is a set of edges (buffers)
- $\text{cons}: E \rightarrow \mathbb{N}$  number of tokens consumed
- $\text{prod}: E \rightarrow \mathbb{N}$  number of tokens produced
- $d: E \rightarrow \mathbb{N}$  number of initial tokens

$d$ : „delay“ (sample offset between input and output)

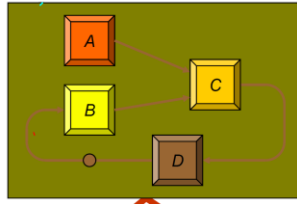
## CD-to-DAT rate converter

- Converts a 44.1 kHz sampling rate to 48 kHz



## Scheduling SDF models

SDF is suitable for automated mapping onto parallel processors and synthesis of parallel circuits.



Sequential

periodic admissible sequential schedule (PASS)



Parallel

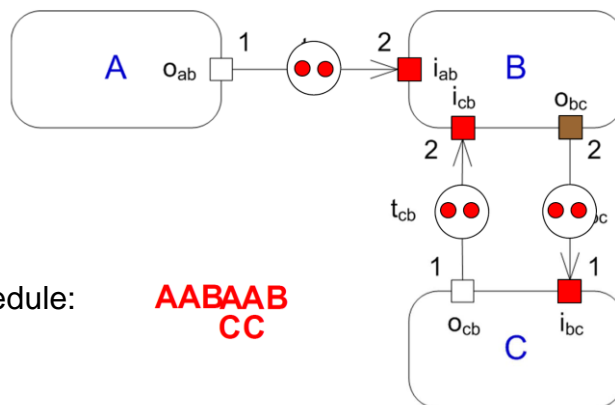
periodic admissible parallel schedule (PAPS)

(admissible = correct schedule, finite amount of memory required)

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## SDF example



static schedule:

**AABAAB  
CC**

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## SDF Scheduling Algorithm Lee/Messerschmitt 1987

### 1. Establish **relative execution rates**

- Generate balance equations
- Solve for smallest positive integer vector  $\mathbf{c}$

### 2. Determine **periodic schedule**

- Form an arbitrarily ordered list of all nodes in the system
- Repeat:
  - For each node in the list, schedule it if it is runnable, trying each node once
  - If each node has been scheduled  $\mathbf{c}_n$  times, stop.
  - If no node can be scheduled, indicate deadlock.

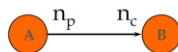
Source: Lee/Messerschmitt, Synchronous Data Flow (1987)

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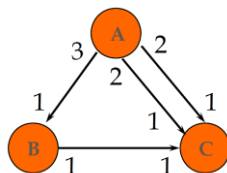
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## Balance equations

- Number of produced tokens must equal number of consumed tokens on every edge



- Firing vector  $v_S$  of schedule  $S$ : number of firings of each actor in  $S$
- $v_S(A) n_p = v_S(B) n_c$  must be satisfied on each edge

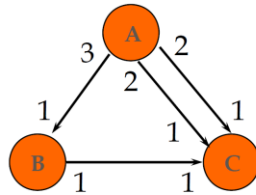


- $3 v_S(A) - v_S(B) = 0$
- $v_S(B) - v_S(C) = 0$
- $2 v_S(A) - v_S(C) = 0$
- $2 v_S(A) - v_S(C) = 0$

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## Balance equations



topology matrix

$$M = \begin{vmatrix} 3 & -1 & 0 \\ 0 & 1 & -1 \\ 2 & 0 & -1 \end{vmatrix}$$

- $M v_S = 0$   
iff  $S$  is periodic
- Full rank (as in this case)
  - no non-zero solution
  - no periodic schedule

the  $(c, r)$ th entry in the matrix is the amount of data produced by node  $c$  on arc  $r$  each time it is involved

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## Rank of a matrix

The rank of a matrix  $\Gamma$  is the number of linearly independent rows or columns.

The equation

$$\Gamma q = \vec{0}$$

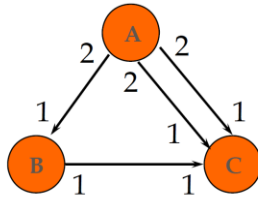
forms a linear combination of the columns of  $\Gamma$ . Such a linear combination can only yield the zero vector if the columns are linearly dependent.

If  $\Gamma$  has  $a$  columns and  $b$  rows, the rank cannot exceed  $\min(a, b)$ .

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## Balance equations



$$M = \begin{vmatrix} 2 & -1 & 0 \\ 0 & 1 & -1 \\ 2 & 0 & -1 \\ 2 & 0 & -1 \end{vmatrix}$$

- Non-full rank
- Infinite number of solutions exist:  
any multiple of  $| 1 \ 2 \ 2 |^T$  satisfies the balance equations
- ABCBC and ABBCC are valid schedules

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## Static SDF scheduling

### SDF scheduling theorem (Lee '86)

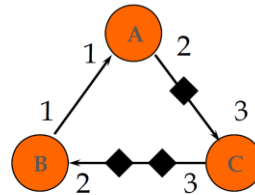
- A connected SDF graph with  $n$  actors has a periodic schedule iff its topology matrix  $M$  has rank  $n-1$
- If  $M$  has rank  $n-1$  then there exists a unique smallest integer solution  $v_S$  to  $M v_S = 0$
- Rank must be at least  $n-1$  because we need at least  $n-1$  edges (connectedness), each providing a linearly independent row
- Rank is at most  $n$  because there are  $n$  actors
- Admissibility is not guaranteed, depends on initial tokens on cycles

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## Admissibility

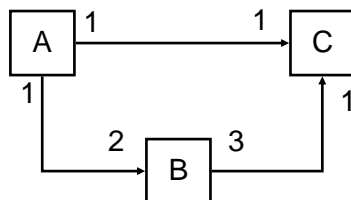


- No admissible schedule: BACBA, then deadlock...
- Adding one token on A→C makes BACBACBA valid
- Making a periodic schedule admissible is always possible, but changes specification...

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## An inconsistent system



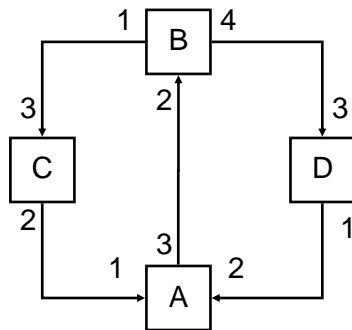
$$\begin{aligned} a - c &= 0 \\ a - 2b &= 0 \\ 3b - c &= 0 \\ 3a - 2c &= 0 \end{aligned}$$

- No way to execute without an unbounded accumulation of tokens
- Only consistent solution is „do nothing“

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## PASS example: 1) firing rates



$$d(AB)=6$$

$$3a - 2b = 0$$

$$4b - 3d = 0$$

$$b - 3c = 0$$

$$2c - a = 0$$

$$d - 2a = 0$$

Solution:

$$a = 2c$$

$$b = 3c$$

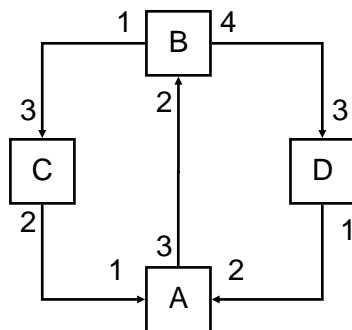
$$d = 4c$$

Smallest solution:  $a=2; b=3; d=4; c=1$

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## PASS example: 2) Simulation



$$d(AB)=6$$

Smallest solution:  
 $a=2; b=3; d=4; c=1$

Possible schedules:

BBBCDDDDAA

BDBDBCADDA

BBDDBDDCAA

(and many more)

BC... not valid

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## Completeness theorem

Given an SDF graph with topology matrix  $M$  and a positive integer vector  $v$  s.t.  $Mv = 0$ , a PASS of period  $p = \mathbf{1}^T q$  exists iff a pass of period  $Np$  exists for any integer  $N$ .

(proof on blackboard)