

# Circuit timing analysis, linear maps, and semantic morphisms

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Tabula

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# Outline

Timing analysis

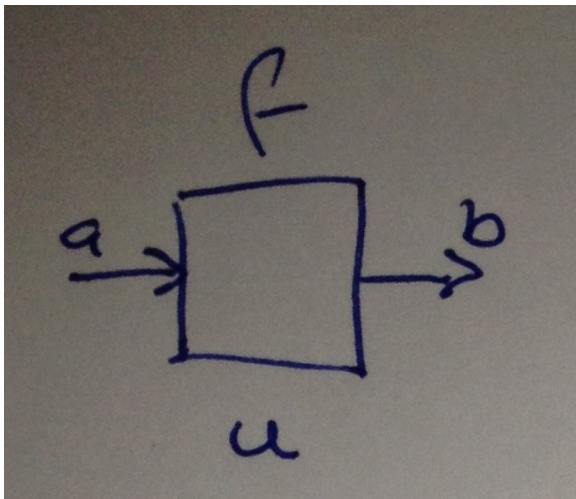
Linear transformations

Semantics and implementation

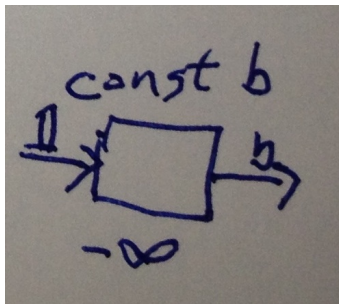
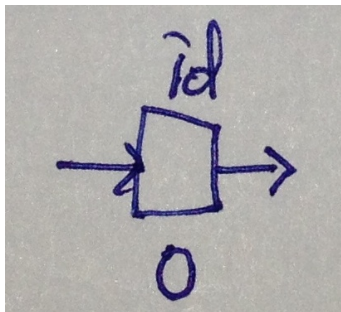
# Timing analysis

# Simple timing analysis

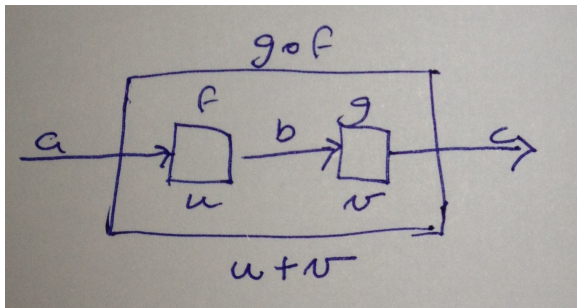
Computation with a time delay:



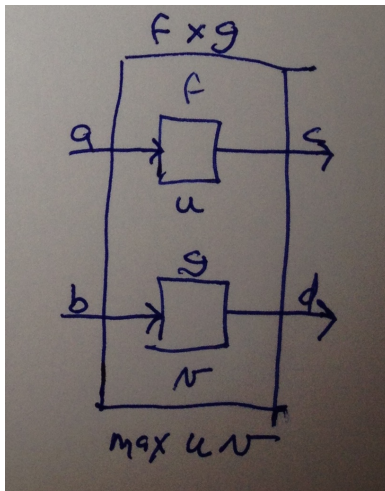
## Trivial timings



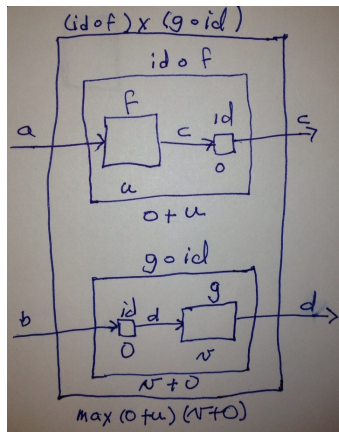
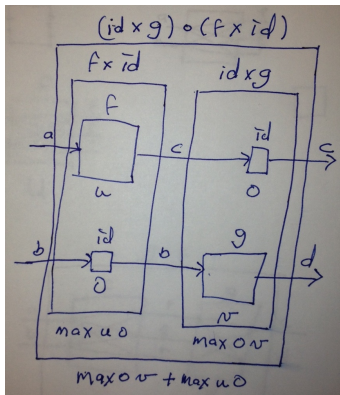
# Sequential composition



# Parallel composition



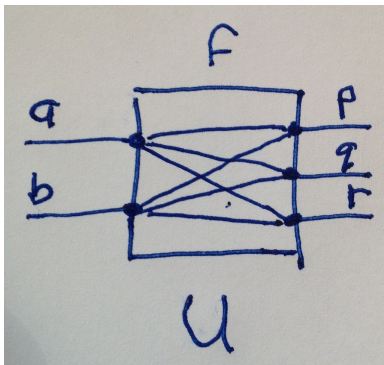
But ...



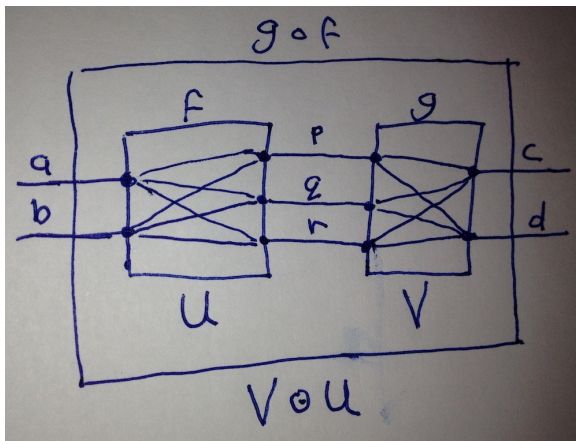
Oops: Same circuit ( $f \times g$ ), different timings.

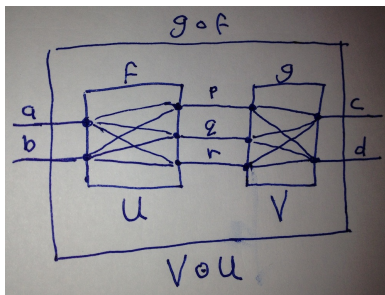


# Multi-path analysis



- ▶ Max delay for *each* input/output pair
- ▶ How do delays *compose*?

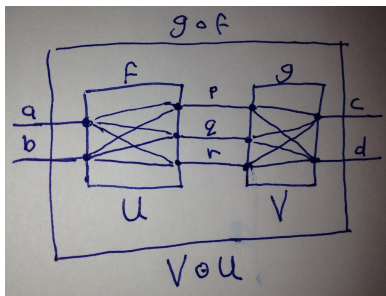
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$V \odot U = W$ , where

$$W_{i,k} = \text{Max}_j (U_{i,j} + V_{j,k})$$

# How do delays *compose*?

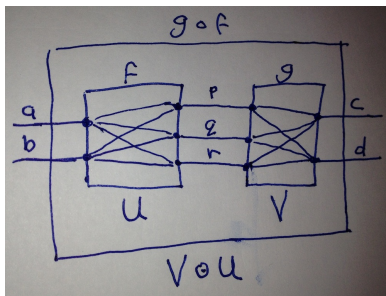


$V \odot U = W$ , where

$$W_{i,k} = \text{Max}_j (U_{i,j} + V_{j,k})$$

Look familiar?

# How do delays *compose*?



$V \odot U = W$ , where

$$W_{i,k} = \text{Max}_j (U_{i,j} + V_{j,k})$$

Look familiar? Matrix multiplication?

# MaxPlus algebra

**type** *Delay* = *MaxPlus Double*

**data** *MaxPlus a* = *MP a*

**instance** *Ord a*  $\Rightarrow$  *AdditiveGroup (MaxPlus a)* **where**

*MP a*  $\hat{+}$  *MP b* = *MP (a 'max' b)*

**instance** (*Ord a*, *Num a*)  $\Rightarrow$  *VectorSpace (MaxPlus a)* **where**

**type** *Scalar (MaxPlus a)* = *a*

*a*  $\cdot$  *MP b* = *MP (a + b)*

Oops – We also need a zero.

*VectorSpace* is overkill. Module over a semi-ring suffices.

# MaxPlus algebra

**type** *Delay* = *MaxPlus Double*

**data** *MaxPlus* *a* =  $-\infty$  | *Fi* *a*

**instance** *Ord a*  $\Rightarrow$  *AdditiveGroup (MaxPlus a)* **where**

$$0 = -\infty$$

$$MP\ a \hat{+} MP\ b = MP\ (a\ 'max'\ b)$$

$$-\infty \hat{+} \_ = -\infty$$

$$\_ \hat{+} -\infty = -\infty$$

**instance** (*Ord a*, *Num a*)  $\Rightarrow$  *VectorSpace (MaxPlus a)* **where**

**type** *Scalar (MaxPlus a)* = *a*

$$a \cdot MP\ b = MP\ (a + b)$$

$$\_ \cdot -\infty = -\infty$$

# Linear transformations



# Representation?

How might we represent linear maps/transformations  $a \rightarrow b$ ?

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How might we represent linear maps/transformations  $a \rightarrow b$ ?

- ▶ Matrices
- ▶ Functions
- ▶ What else?

# Matrices

$$\begin{bmatrix} a_{11} & \cdots & a_{1m} \\ \vdots & \ddots & \vdots \\ a_{n1} & \cdots & a_{nm} \end{bmatrix}$$

Static typing?

# Statically sized matrices

**type**  $Mat\ m\ n\ a = Vec\ m\ (Vec\ n\ a)$

$(\circ) :: (IsNat\ m, IsNat\ o) \Rightarrow$   
 $Mat\ n\ o\ D \rightarrow Mat\ m\ n\ D \rightarrow Mat\ o\ m\ D$   
 $no\ \circ\ mn = crossF\ dot\ (transpose\ no)\ mn$

$crossF :: (IsNat\ m, IsNat\ o) \Rightarrow$   
 $(a \rightarrow b \rightarrow c) \rightarrow Vec\ o\ a \rightarrow Vec\ m\ b \rightarrow Mat\ o\ m\ c$   
 $crossF\ f\ as\ bs = (\lambda a \rightarrow f\ a\ \langle \$ \rangle\ bs)\ \langle \$ \rangle\ as$

$dot :: (Ord\ a, Num\ a) \Rightarrow$   
 $Vec\ n\ a \rightarrow Vec\ n\ a \rightarrow a$   
 $u\ 'dot'\ v = sum\ (zipWithV\ (*))\ u\ v$

# Generalizing

**type**  $Mat\ m\ n\ a = m\ (n\ a)$

$(\circ) :: (Functor\ m, Applicative\ n, Traversable\ n, Applicative\ o) \Rightarrow$   
 $Mat\ n\ o\ D \rightarrow Mat\ m\ n\ D \rightarrow Mat\ o\ m\ D$   
 $no\ \circ\ mn = crossF\ dot\ (sequenceA\ no)\ mn$

$crossF :: (Functor\ m, Functor\ o) \Rightarrow$   
 $(a \rightarrow b \rightarrow c) \rightarrow o\ a \rightarrow m\ b \rightarrow Mat\ o\ m\ c$   
 $crossF\ f\ as\ bs = (\lambda a \rightarrow f\ a\ \langle \$ \rangle\ bs)\ \langle \$ \rangle\ as$

$dot :: (Foldable\ n, Applicative\ n, Ord\ a, Num\ a) \Rightarrow$   
 $n\ a \rightarrow n\ a \rightarrow a$   
 $u\ 'dot'\ v = sum\ (liftA2\ (*)\ u\ v)$

# Represent via type family (old)

```

class VectorSpace v  $\Rightarrow$  HasBasis v where
  type Basis v :: *
  coord :: v  $\rightarrow$  (Basis v  $\rightarrow$  Scalar v)
  
```

Linear map as memoized function from basis:

```

newtype a  $\rightarrow$  b = L (Basis a  $\rightarrow^M$  b)
  
```

See *Beautiful differentiation* (ICFP 2009).

# Represent as GADT

**data**  $a \multimap b$  **where**

$Dot :: InnerSpace\ b \Rightarrow$

$b \rightarrow (b \multimap Scalar\ b)$

$(:\Delta) :: VS_3\ a\ c\ d \Rightarrow$  -- vector spaces with same scalar field

$(a \multimap c) \rightarrow (a \multimap d) \rightarrow (a \multimap c \times d)$

# Semantics and implementation



## Semantics

$$\llbracket \cdot \rrbracket :: (a \multimap b) \rightarrow (a \rightarrow b)$$

$$\llbracket \text{Dot } b \rrbracket = \text{dot } b$$

$$\llbracket f : \Delta g \rrbracket = \llbracket f \rrbracket \Delta \llbracket g \rrbracket$$

where, on functions,

$$(f \Delta g) a = (f a, g a)$$

Recall:

**data**  $a \multimap b$  **where**

$$\text{Dot} :: \text{InnerSpace } b \Rightarrow b \rightarrow (b \multimap \text{Scalar } b)$$

$$(:\Delta) :: \text{VS}_3 a c d \Rightarrow (a \multimap c) \rightarrow (a \multimap d) \rightarrow (a \multimap c \times d)$$

# Semantic type class morphisms

*Category* instance specification:

$$\begin{aligned} \llbracket id \rrbracket &\equiv id \\ \llbracket g \circ f \rrbracket &\equiv \llbracket g \rrbracket \circ \llbracket f \rrbracket \end{aligned}$$

*Arrow* instance specification:

$$\begin{aligned} \llbracket f \triangle g \rrbracket &\equiv \llbracket f \rrbracket \triangle \llbracket g \rrbracket \\ \llbracket f \times g \rrbracket &\equiv \llbracket f \rrbracket \times \llbracket g \rrbracket \end{aligned}$$

where

$$\begin{aligned} (\triangle) &:: \text{Arrow } (\rightsquigarrow) \Rightarrow (a \rightsquigarrow c) \rightarrow (a \rightsquigarrow d) \rightarrow (a \rightsquigarrow c \times d) \\ (\times) &:: \text{Arrow } (\rightsquigarrow) \Rightarrow (a \rightsquigarrow c) \rightarrow (b \rightsquigarrow d) \rightarrow (a \times b \rightsquigarrow c \times d) \end{aligned}$$

The *Category* and *Arrow* laws then follow.

# Deriving a *Category* instance

One case:

$$\begin{aligned}
 & \llbracket (f :_{\Delta} g) \circ h \rrbracket \\
 & \equiv (\llbracket f \rrbracket \Delta \llbracket g \rrbracket) \circ \llbracket h \rrbracket \\
 & \equiv \llbracket f \rrbracket \circ \llbracket h \rrbracket \Delta \llbracket g \rrbracket \circ \llbracket h \rrbracket \\
 & \equiv \llbracket f \circ h \Delta g \circ h \rrbracket
 \end{aligned}$$

(where  $f \circ h \Delta g \circ h \equiv (f \circ h) \Delta (g \circ h)$ ). Uses:

$$(f \Delta g) \circ h \equiv f \circ h \Delta g \circ h$$

Implementation:

$$(f :_{\Delta} g) \circ h = f \circ h :_{\Delta} g \circ h$$

Deriving a *Category* instance

$$\begin{aligned}
 & \llbracket \text{Dot } s \circ \text{Dot } b \rrbracket \\
 \equiv & \text{dot } s \circ \text{dot } b \\
 \equiv & \text{dot } (s \cdot b) \\
 \equiv & \llbracket \text{Dot } (s \cdot b) \rrbracket
 \end{aligned}$$

$$\begin{aligned}
 & \llbracket \text{Dot } (a, b) \circ (f \triangle g) \rrbracket \\
 \equiv & \text{dot } (a, b) \circ (\llbracket f \rrbracket \triangle \llbracket g \rrbracket) \\
 \equiv & \text{add} \circ (\text{dot } a \circ \llbracket f \rrbracket \triangle \text{dot } b \circ \llbracket g \rrbracket) \\
 \equiv & \text{dot } a \circ \llbracket f \rrbracket \hat{+} \text{dot } b \circ \llbracket g \rrbracket \\
 \equiv & \llbracket \text{Dot } a \circ f \hat{+} \text{Dot } b \circ g \rrbracket
 \end{aligned}$$

Uses:

$$\text{dot } (a, b) \quad \equiv \text{add} \circ (\text{dot } a \times \text{dot } b)$$

$$(k \times h) \circ (f \triangle g) \equiv k \circ f \triangle h \circ g$$

$$\llbracket f \hat{+} g \rrbracket \quad \equiv \llbracket f \rrbracket \hat{+} \llbracket g \rrbracket$$

Deriving an *Arrow* instance

$$\begin{aligned} & \llbracket f \triangle g \rrbracket \\ \equiv & \llbracket f \rrbracket \triangle \llbracket g \rrbracket \\ \equiv & \llbracket f \triangle g \rrbracket \end{aligned}$$

$$\begin{aligned} & \llbracket f \times g \rrbracket \\ \equiv & \llbracket f \rrbracket \times \llbracket g \rrbracket \\ \equiv & \llbracket f \rrbracket \circ fst \triangle \llbracket g \rrbracket \circ snd \\ \equiv & \llbracket compFst f \rrbracket \triangle \llbracket compSnd g \rrbracket \\ \equiv & \llbracket compFst f \triangle compSnd g \rrbracket \end{aligned}$$

assuming

$$\begin{aligned} \llbracket compFst f \rrbracket & \equiv \llbracket f \rrbracket \circ fst \\ \llbracket compSnd g \rrbracket & \equiv \llbracket g \rrbracket \circ snd \end{aligned}$$

Composing with *fst* and *snd*

$$\text{compFst} :: VS_3 a b c \Rightarrow a \multimap c \rightarrow a \times b \multimap c$$

$$\text{compSnd} :: VS_3 a b c \Rightarrow b \multimap c \rightarrow a \times b \multimap c$$

Derivation:

$$\text{dot } a \circ \text{fst} \equiv \text{dot } (a, 0)$$

$$(f \triangle g) \circ \text{fst} \equiv f \circ \text{fst} \triangle g \circ \text{fst}$$

Implementation:

$$\text{compFst } (\text{Dot } a) = \text{Dot } (a, 0)$$

$$\text{compFst } (f \triangle g) = \text{compFst } f \triangle \text{compFst } g$$

$$\text{compSnd } (\text{Dot } b) = \text{Dot } (0, b)$$

$$\text{compSnd } (f \triangle g) = \text{compSnd } f \triangle \text{compSnd } g$$

## Adding linear maps

$$\begin{aligned}
 & \llbracket \text{Dot } b \hat{+} \text{Dot } c \rrbracket \\
 \equiv & \text{dot } b \hat{+} \text{dot } c \\
 \equiv & \text{dot } (b \hat{+} c) \\
 \equiv & \llbracket \text{Dot } (b \hat{+} c) \rrbracket
 \end{aligned}$$

$$\begin{aligned}
 & \llbracket (f :_{\Delta} g) \hat{+} (h :_{\Delta} k) \rrbracket \\
 \equiv & (\llbracket f \rrbracket \Delta \llbracket g \rrbracket) \hat{+} (\llbracket h \rrbracket \Delta \llbracket k \rrbracket) \\
 \equiv & (\llbracket f \rrbracket \hat{+} \llbracket h \rrbracket) \Delta (\llbracket g \rrbracket \hat{+} \llbracket k \rrbracket) \\
 \equiv & \llbracket (f \hat{+} h) \Delta (g \hat{+} k) \rrbracket
 \end{aligned}$$

Other cases don't type-check.

Uses (on functions):

$$(f \Delta g) \hat{+} (h \Delta k) \equiv (f \hat{+} h) \Delta (g \hat{+} k)$$

# What next?

- ▶ Fancier timing analysis
- ▶ What else is linear?
- ▶ More examples of semantic type class morphisms