

# Linear Types for Controlled Array Fusion

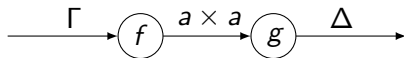
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Chalmers University of Technology

PFP Course, March 31st 2014

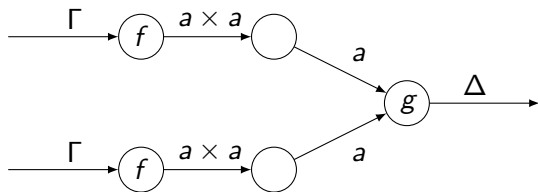
# Fusion

- ▶ Elimination of intermediate data structures
- ▶ Example:  $\text{foldr}(+)0 \circ \text{map}(*n)$
- ▶ Similar to partial evaluation
- ▶ Crucial for performance (laziness seems to help, but it is useless in case of parallelism)
- ▶ But, it is treated as an *optimisation*

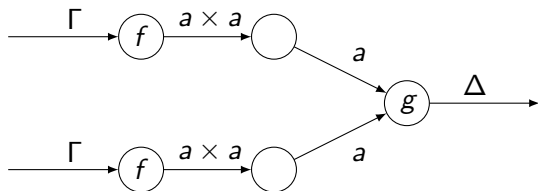
## Fusion attempt: starting point



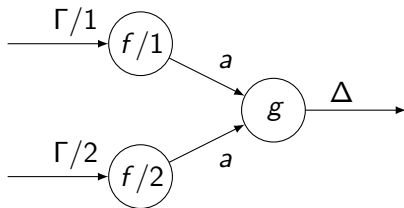
## Fusion attempt...



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One can *hope* for:







Remember, all I'm offering is the truth. Nothing more.

# Duality

- ▶ Every type  $a$  has a *dual*, written  $a^\perp$
- ▶ Dualisation is involutive:  $(a^\perp)^\perp = a$
- ▶ Returning a value of type  $a$  is the same as taking an argument of type  $a^\perp$
- ▶  $a \rightarrow b$  becomes  $a \times b^\perp \rightarrow \perp$
- ▶ NB:  $\perp$  indicates termination rather than non-termination



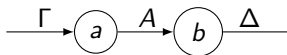
# Linearity

Conservation principle

$$\frac{}{x : A, y : A^\perp \vdash x \leftrightarrow y} \text{Ax}$$

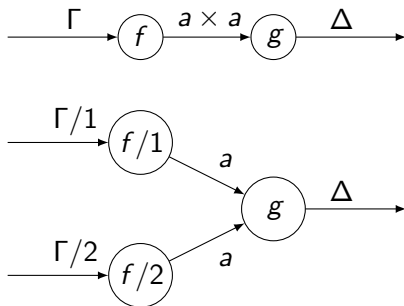


$$\frac{\Gamma, x : A^\perp \vdash a \quad y : A, \Delta \vdash b}{\Gamma, \Delta \vdash \text{cut } \{x : A^\perp \mapsto a; y : A \mapsto b\}} \text{CUT}$$



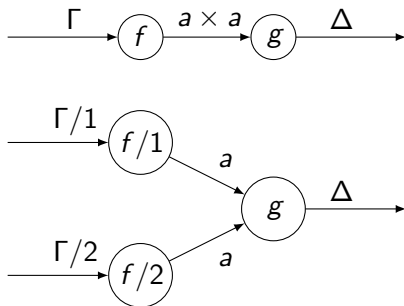
## Back to the example

We would like to *guarantee* well-behaved fusion:



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Need to use a tensor ( $\otimes$ ) product, which guarantees that its components are produced independently.

## Technically:

▶  $(A \otimes B)^\perp = A^\perp \wp B^\perp$



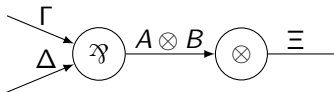
$$\frac{\Gamma, x : A, y : B \vdash a}{\Gamma, z : A \otimes B \vdash \text{let } x, y = z; a} \otimes$$



$$\frac{\Gamma, x : A \vdash a \quad y : B, \Delta \vdash b}{\Gamma, z : A \wp B, \Delta \vdash \text{connect } z \text{ to } \{x \mapsto a; y \mapsto b\}} \wp$$

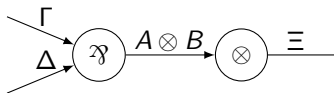
## Fusion works!

$$\frac{\frac{\Gamma, A^\perp \vdash \quad \Delta, B^\perp \vdash}{\Gamma, \Delta, A^\perp \wp B^\perp \vdash} \wp \quad \frac{A, B, \Xi \vdash}{A \otimes B, \Xi \vdash} \otimes}{\Gamma, \Delta, \Xi \vdash} \text{CUT}$$

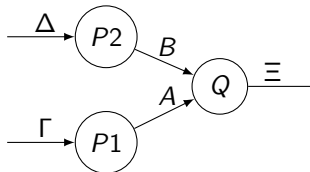


# Fusion works!

$$\frac{\frac{\Gamma, A^\perp \vdash \quad \Delta, B^\perp \vdash}{\Gamma, \Delta, A^\perp \wp B^\perp \vdash} \wp \quad \frac{A, B, \Xi \vdash}{A \otimes B, \Xi \vdash} \otimes}{\Gamma, \Delta, \Xi \vdash} \text{CUT}$$



$$\frac{\frac{\Gamma, A^\perp \vdash \quad \frac{\Delta, B^\perp \vdash \quad B, A, \Xi \vdash}{A, \Delta, \Xi \vdash} \text{CUT}}{\Gamma, \Delta, \Xi \vdash} \text{CUT}}{\Gamma, \Delta, \Xi \vdash} \text{CUT}$$



# Crucial question: who is in control?

Two kinds of “products”:

- ▶  $A \otimes B$ : the consumer has control
- ▶  $A \bowtie B$ : the producer has control

Example:

- ▶ sallad  $\otimes$  pizza vs
- ▶ sallad  $\bowtie$  pizza

NB: in control means that the order is chosen dynamically, and some order must be chosen.

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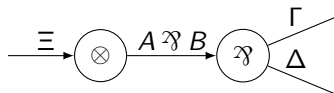
NB: in control means that the order is chosen dynamically, and some order must be chosen.

- ▶ Possible slogan: *strategies in the types*



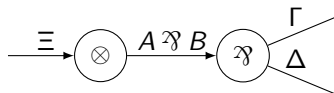
## Fusion when the consumer is in control:

$$\frac{\frac{\Xi, A^\perp, B^\perp \vdash}{\Xi, A^\perp \otimes B^\perp \vdash} \otimes \quad \frac{A, \Gamma \vdash \quad B, \Delta \vdash \wp}{A \wp B, \Gamma, \Delta \vdash} \wp}{\Gamma, \Delta, \Xi \vdash} \text{CUT}$$

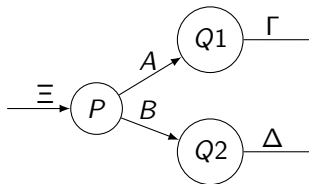


## Fusion when the consumer is in control:

$$\frac{\frac{\Xi, A^\perp, B^\perp \vdash}{\Xi, A^\perp \otimes B^\perp \vdash} \otimes \quad \frac{A, \Gamma \vdash \quad B, \Delta \vdash \wp}{A \wp B, \Gamma, \Delta \vdash} \wp}{\Gamma, \Delta, \Xi \vdash} \text{CUT}$$



$$\frac{\frac{\Gamma, A \vdash \quad A^\perp, \Delta, \Xi \vdash}{\Gamma, \Delta, \Xi \vdash} \text{CUT} \quad \frac{\Delta, B \vdash \quad B^\perp, A^\perp, \Xi \vdash}{\Gamma, \Delta, \Xi \vdash} \text{CUT}}{\Gamma, \Delta, \Xi \vdash}$$



remark

( $a \multimap b$  is a defined to be  $a^\perp \wp b$ )

## Conversions between $\wp$ and $\otimes$ .

►  $\text{alloc} : a \wp b \multimap a \otimes b$

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- ▶  $\text{alloc} : a \wp b \multimap a \otimes b$
- ▶  $\text{par} : a \otimes b \multimap a \wp b$
- ▶  $\text{seqR} : a \otimes b \multimap a \wp b$
- ▶  $\text{seqL} : a \otimes b \multimap a \wp b$

## Generalisation to Arrays (simplified)

$$\frac{\Gamma, x : A^m \vdash a}{\Gamma, z : \bigotimes_m A \vdash \text{let } x = \text{slice } z; a} \bigotimes$$

$$\frac{\Gamma, x : A \vdash a}{\Gamma^n, z : \bigotimes_n A \vdash \text{coslice } z \{x \mapsto a\}} \bigotimes$$

## Generalisation to Arrays (not so simplified)

$$\frac{\Gamma, x : A^m \vdash a}{\Gamma, z : \bigotimes_m A \vdash \text{let } x = \text{slice } z; a} \bigotimes$$

$$\frac{\Gamma, x : A \vdash a \quad \Delta, y : A \vdash b}{\Gamma^n, \Delta^m, z : \bigotimes_{n+m} A \vdash \text{coslice } z \{x \mapsto a; y \mapsto b\}} \bigotimes$$



# Simple examples

Only one argument/result can be in control.

- ▶ `map ::`

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- ▶  $\text{map} :: \bigotimes_n (a \multimap b) \multimap \bigotimes_n a \multimap \bigotimes_n b$
- ▶  $\text{map}' ::$

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- ▶  $\text{map} :: \bigotimes_n (a \multimap b) \multimap \bigotimes_n a \multimap \bigotimes_n b$
- ▶  $\text{map}' :: \bigotimes_n (a \multimap b) \multimap \wp_n a \multimap \wp_n b$
- ▶  $\text{zipWith} ::$

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- ▶  $\text{map}' :: \bigotimes_n (a \multimap b) \multimap \wp_n a \multimap \wp_n b$
- ▶  $\text{zipWith} :: \bigotimes_n (a \multimap b \multimap c) \multimap \bigotimes_n a \multimap \bigotimes_n b \multimap \bigotimes_n c$
- ▶  $\text{zipWith}' ::$

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- ▶  $\text{zipWith}' :: \bigotimes_n (a \multimap b \multimap c) \multimap \bigotimes_n a \multimap \wp_n b \multimap \wp_n c$
- ▶  $\text{append} ::$

## Simple examples

Only one argument/result can be in control.

- ▶  $\text{map} :: \bigotimes_n (a \multimap b) \multimap \bigotimes_n a \multimap \bigotimes_n b$
- ▶  $\text{map}' :: \bigotimes_n (a \multimap b) \multimap \wp_n a \multimap \wp_n b$
- ▶  $\text{zipWith} :: \bigotimes_n (a \multimap b \multimap c) \multimap \bigotimes_n a \multimap \bigotimes_n b \multimap \bigotimes_n c$
- ▶  $\text{zipWith}' :: \bigotimes_n (a \multimap b \multimap c) \multimap \bigotimes_n a \multimap \wp_n b \multimap \wp_n c$
- ▶  $\text{append} :: \bigotimes_n a \multimap \bigotimes_m a \multimap \bigotimes_{n+m} a$
- ▶  $\text{append}' ::$

## Simple examples

Only one argument/result can be in control.

- ▶  $\text{map} :: \bigotimes_n (a \multimap b) \multimap \bigotimes_n a \multimap \bigotimes_n b$
- ▶  $\text{map}' :: \bigotimes_n (a \multimap b) \multimap \wp_n a \multimap \wp_n b$
- ▶  $\text{zipWith} :: \bigotimes_n (a \multimap b \multimap c) \multimap \bigotimes_n a \multimap \bigotimes_n b \multimap \bigotimes_n c$
- ▶  $\text{zipWith}' :: \bigotimes_n (a \multimap b \multimap c) \multimap \bigotimes_n a \multimap \wp_n b \multimap \wp_n c$
- ▶  $\text{append} :: \bigotimes_n a \multimap \bigotimes_m a \multimap \bigotimes_{n+m} a$
- ▶  $\text{append}' :: \wp_n a \multimap \wp_m a \multimap \wp_{n+m} a$

## Conversions between $\mathcal{Y}$ and $\otimes$ .

► alloc :  $\mathcal{Y}_n a \multimap \otimes_n a$



## Conversions between $\mathcal{A}$ and $\otimes$ .

- ▶ alloc :  $\mathcal{A}_n a \multimap \otimes_n a$
- ▶ parallel :  $\otimes_n a \multimap \mathcal{A}_n a$
- ▶ sequential :  $\otimes_n a \multimap \mathcal{A}_n a$

# Allocation

If  $A$  is a data type:

$$\frac{\Gamma, A^{\perp n} \vdash \quad A^n, \Delta \vdash}{\Gamma, \Delta \vdash} \text{FREEZE}$$

# Loops

- ▶ Loops are realisation of parallel opportunities
- ▶ They can either be sequential or parallel
- ▶ Example of a parallel loop:
  - ▶ 
$$\frac{B[0]^\perp, \Delta \vdash \quad B[k], B[k], B[k+1]^\perp \vdash \quad B[n], \Gamma \vdash}{n : !x; \Gamma, \Delta^{2^n} \vdash} \text{FOLDMAP}$$
- ▶ See lecture 9 (skeletons) and in particular map-reduce (lecture 10)

# Full example: dot product (0)

$$\begin{array}{c}
 \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a^\perp, a \vdash} \text{AX} \\
 \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a, a^\perp, a^\perp \wp a \vdash} \text{AX} \quad \frac{}{a^\perp, a \vdash} \text{AX} \\
 \frac{}{a, a, a^\perp, a^\perp \wp a^\perp \wp a \vdash} \text{LOAD} \quad \frac{}{a, a^\perp, a^\perp \wp a \vdash} \text{AX} \quad \frac{}{a^\perp, a \vdash} \text{AX} \\
 \frac{}{mul : a^\perp \wp a^\perp \wp a; a, a, a^\perp \vdash} \text{AX} \quad \frac{}{a, a, a^\perp, a^\perp \wp a^\perp \wp a \vdash} \text{LOAD} \quad \frac{}{a, a^\perp \vdash} \text{AX} \\
 \frac{}{mul : a^\perp \wp a^\perp \wp a; a^{2^n}, a^{2^n}, \wp_{2^n} a^\perp \vdash} \otimes \quad \frac{}{a^\perp, a \vdash} \text{AX} \quad \frac{}{plus : a^\perp \wp a^\perp \wp a; a, a, a^\perp \vdash} \text{LOAD} \quad \frac{}{a, a^\perp \vdash} \text{AX} \\
 \frac{}{mul : a^\perp \wp a^\perp \wp a; \otimes_{2^n} a, \otimes_{2^n} a, \wp_{2^n} a^\perp \vdash} \otimes \quad \frac{}{plus : a^\perp \wp a^\perp \wp a; a^{2^n}, a^\perp \vdash} \otimes \quad \frac{}{a^\perp, a \vdash} \text{AX} \\
 \frac{}{mul : a^\perp \wp a^\perp \wp a; \otimes_{2^n} a, \otimes_{2^n} a, \wp_{2^n} a^\perp \vdash} \otimes \quad \frac{}{plus : a^\perp \wp a^\perp \wp a; \otimes_{2^n} a, a^\perp \vdash} \text{CUT} \quad \frac{}{a, a^\perp \vdash} \text{FOLDMAP} \\
 \frac{}{plus : a^\perp \wp a^\perp \wp a, mul : a^\perp \wp a^\perp \wp a; \otimes_{2^n} a, \otimes_{2^n} a, a^\perp \vdash}
 \end{array}$$

# Full example: dot product (1)

$$\begin{array}{c}
 \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a^\perp, a \vdash} \text{AX} \quad \frac{}{a^\perp, a \vdash} \text{AX} \\
 \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a, a^\perp, a^\perp \wp a \vdash} \text{AX} \quad \frac{}{a, a^\perp, a^\perp \wp a \vdash} \text{AX} \\
 \frac{}{a, a, a^\perp, a^\perp \wp a^\perp \wp a \vdash} \text{LOAD} \quad \frac{}{a^\perp, a \vdash} \text{AX} \quad \frac{}{a, a, a^\perp, a^\perp \wp a^\perp \wp a \vdash} \text{LOAD} \quad \frac{}{a, a^\perp \vdash} \text{AX} \\
 \frac{}{mul : a^\perp \wp a^\perp \wp a; a, a, a^\perp \vdash} \text{LOAD} \quad \frac{}{a^\perp, a \vdash} \text{AX} \quad \frac{}{plus : a^\perp \wp a^\perp \wp a; a, a, a^\perp \vdash} \text{LOAD} \quad \frac{}{a, a^\perp \vdash} \text{FOLDMAP} \\
 \frac{}{mul : a^\perp \wp a^\perp \wp a; a^{2^n}, a^{2^n}, \wp_{2^n} a^\perp \vdash} \text{LOAD} \quad \frac{}{plus : a^\perp \wp a^\perp \wp a; a^{2^n}, a^\perp \vdash} \text{LOAD} \\
 \frac{}{mul : a^\perp \wp a^\perp \wp a; a^{2^n}, \otimes_{2^n} a, \wp_{2^n} a^\perp \vdash} \otimes \quad \frac{}{plus : a^\perp \wp a^\perp \wp a; \otimes_{2^n} a, a^\perp \vdash} \otimes \\
 \frac{}{plus : a^\perp \wp a^\perp \wp a, mul : a^\perp \wp a^\perp \wp a; a^{2^n}, \otimes_{2^n} a, a^\perp \vdash} \otimes \quad \frac{}{plus : a^\perp \wp a^\perp \wp a; \otimes_{2^n} a, a^\perp \vdash} \text{CUT} \\
 \frac{}{plus : a^\perp \wp a^\perp \wp a, mul : a^\perp \wp a^\perp \wp a; \otimes_{2^n} a, \otimes_{2^n} a, a^\perp \vdash} \otimes
 \end{array}$$



# Full example: dot product (3)

$$\begin{array}{c}
 \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a^\perp, a \vdash} \text{AX} \quad \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a^\perp, a \vdash} \text{AX} \\
 \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a, a^\perp, a^\perp \wp a \vdash} \text{AX} \quad \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a, a^\perp, a^\perp \wp a \vdash} \text{AX} \\
 \frac{}{a, a, a^\perp, a^\perp \wp a^\perp \wp a \vdash} \text{LOAD} \quad \frac{}{a^\perp, a \vdash} \text{AX} \quad \frac{}{a, a, a^\perp, a^\perp \wp a^\perp \wp a \vdash} \text{LOAD} \quad \frac{}{a, a^\perp \vdash} \text{AX} \\
 \frac{}{mul : a^\perp \wp a^\perp \wp a; a, a, a^\perp \vdash} \text{LOAD} \quad \frac{}{plus : a^\perp \wp a^\perp \wp a; a^{2^n}, a^\perp \vdash} \text{LOAD} \quad \frac{}{a, a^\perp \vdash} \text{FOLDMAP} \\
 \frac{}{plus : a^\perp \wp a^\perp \wp a, mul : a^\perp \wp a^\perp \wp a; a^{2^n}, a^{2^n}, a^\perp \vdash} \text{CUT}_{2^n} \\
 \frac{}{plus : a^\perp \wp a^\perp \wp a, mul : a^\perp \wp a^\perp \wp a; a^{2^n}, \otimes_{2^n} a, a^\perp \vdash} \otimes \\
 \frac{}{plus : a^\perp \wp a^\perp \wp a, mul : a^\perp \wp a^\perp \wp a; \otimes_{2^n} a, \otimes_{2^n} a, a^\perp \vdash} \otimes
 \end{array}$$

# Full example: dot product (4)

$$\begin{array}{c}
 \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a^\perp, a^\perp \vdash} \text{AX} \quad \frac{}{a^\perp, a^\perp \vdash} \text{AX} \\
 \frac{}{a, a^\perp, a^\perp \wp a^\perp \vdash} \text{AX} \quad \frac{}{a^\perp, a^\perp \wp a^\perp \vdash} \text{AX} \\
 \frac{}{a, a, a^\perp, a^\perp \wp a^\perp \wp a^\perp \vdash} \text{LOAD} \quad \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a, a^\perp, a^\perp \wp a^\perp \vdash} \text{AX} \\
 \frac{}{mul : a^\perp \wp a^\perp \wp a; a, a, a^\perp \vdash} \text{CUT} \quad \frac{}{a, a, a^\perp, a^\perp \wp a^\perp \wp a^\perp \vdash} \text{LOAD} \quad \frac{}{a, a^\perp \vdash} \text{AX} \\
 \frac{}{plus : a^\perp \wp a^\perp \wp a; a^\perp, a, a^\perp \vdash} \text{FOLDMAP} \\
 \frac{}{plus : a^\perp \wp a^\perp \wp a, mul : a^\perp \wp a^\perp \wp a; a^{2^n}, a^{2^n}, a^\perp \vdash} \otimes \\
 \frac{}{plus : a^\perp \wp a^\perp \wp a, mul : a^\perp \wp a^\perp \wp a; a^{2^n}, \otimes_{2^n} a, a^\perp \vdash} \otimes \\
 \frac{}{plus : a^\perp \wp a^\perp \wp a, mul : a^\perp \wp a^\perp \wp a; \otimes_{2^n} a, \otimes_{2^n} a, a^\perp \vdash} \otimes
 \end{array}$$



# Full example: dot product (5)

$$\begin{array}{c}
 \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a^\perp, a^\perp \vdash} \text{AX} \quad \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a^\perp, a^\perp \vdash} \text{AX} \\
 \frac{}{a^\perp, a, a^\perp \vdash} \text{AX} \quad \frac{}{a, a^\perp, a^\perp \vdash} \text{AX} \\
 \frac{}{a^\perp, a, a, a^\perp \vdash} \text{LOAD} \quad \frac{}{a, a, a^\perp, a^\perp \vdash} \text{LOAD} \quad \frac{}{a, a^\perp \vdash} \text{AX} \\
 \frac{}{mul : a^\perp \vdash a^\perp \vdash a; a^\perp, a, a^\perp \vdash} \text{FOLDMAP} \quad \frac{}{plus : a^\perp \vdash a^\perp \vdash a; a^\perp, a, a^\perp \vdash} \text{FOLDMAP} \\
 \frac{}{plus : a^\perp \vdash a^\perp \vdash a, mul : a^\perp \vdash a^\perp \vdash a; a^{2^n}, a^{2^n}, a^\perp \vdash} \otimes \\
 \frac{}{plus : a^\perp \vdash a^\perp \vdash a, mul : a^\perp \vdash a^\perp \vdash a; a^{2^n}, \otimes_{2^n} a, a^\perp \vdash} \otimes \\
 \frac{}{plus : a^\perp \vdash a^\perp \vdash a, mul : a^\perp \vdash a^\perp \vdash a; \otimes_{2^n} a, \otimes_{2^n} a, a^\perp \vdash} \otimes
 \end{array}$$

Done!

















# More complicated example: stencil (8)

$$\begin{array}{c}
 \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a, a^\perp \vdash} \text{AX} \\
 \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a, a^\perp, a^\perp \wp a \vdash} \wp \quad \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a, a^\perp, a^\perp \wp a \vdash} \wp \\
 \frac{}{a, a, a^\perp, a^\perp \wp a^\perp \wp a \vdash} \text{LOAD} \quad \frac{}{a, a, a^\perp, a^\perp \wp a^\perp \wp a \vdash} \text{LOAD} \\
 \frac{}{s : a^\perp \wp a^\perp \wp a; a, a, a^\perp \vdash} \text{LOAD} \quad \frac{}{s : a^\perp \wp a^\perp \wp a; a, a, a^\perp \vdash} \wp \\
 \frac{}{s : a^\perp \wp a^\perp \wp a; a, a^n, a^n, a, \wp_{n+1} a^\perp \vdash} \text{SPLIT} \\
 \frac{}{s : a^\perp \wp a^\perp \wp a; a^{n+1}, a^n, a, \wp_{n+1} a^\perp \vdash} \otimes \\
 \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{s : a^\perp \wp a^\perp \wp a; \otimes_{n+1} a, a^n, a, \wp_{n+1} a^\perp \vdash} \otimes \\
 \frac{}{a^n, a, \wp_{n+1} a^\perp \vdash} \text{CUT} \quad \frac{}{s : a^\perp \wp a^\perp \wp a; \otimes_{n+1} a, \otimes_n a, a, \wp_{n+1} a^\perp \vdash} \otimes \\
 \frac{}{s : a^\perp \wp a^\perp \wp a; a^n, \otimes_n a, a, a, \wp_{n+1} a^\perp \vdash} \otimes \\
 \frac{}{s : a^\perp \wp a^\perp \wp a; \otimes_n a, \otimes_n a, a, a, \wp_{n+1} a^\perp \vdash} \text{SPLIT} \\
 \frac{}{s : a^\perp \wp a^\perp \wp a; (\otimes_n a)^{1+1}, a, a, \wp_{n+1} a^\perp \vdash} \wp \\
 \frac{}{s : a^\perp \wp a^\perp \wp a; (\otimes_n a)^{k+k}, a^k, a^k, \wp_k \wp_{n+1} a^\perp \vdash} \otimes \\
 \frac{}{s : a^\perp \wp a^\perp \wp a; \otimes_{k+k} \otimes_n a, a^k, a^k, \wp_k \wp_{n+1} a^\perp \vdash} \otimes
 \end{array}$$

# More complicated example: stencil (9)

$$\begin{array}{c}
 \frac{}{a, a^\perp \vdash} \text{Ax} \quad \frac{}{a, a^\perp \vdash} \text{Ax} \quad \frac{}{a^\perp, a \vdash} \text{Ax} \quad \frac{}{a^\perp, a \vdash} \text{Ax} \\
 \frac{}{a, a^\perp \vdash} \text{Ax} \quad \frac{}{a, a^\perp, a^\perp \wp a \vdash} \text{Ax} \quad \frac{}{a, a^\perp \vdash} \text{Ax} \quad \frac{}{a, a^\perp, a^\perp \wp a \vdash} \text{Ax} \\
 \frac{}{a, a^\perp, a, a^\perp \wp a^\perp \wp a \vdash} \text{LOAD} \quad \frac{}{a, a^\perp, a, a^\perp \wp a^\perp \wp a \vdash} \text{LOAD} \\
 \frac{}{s : a^\perp \wp a^\perp \wp a; a, a^\perp, a \vdash} \text{LOAD} \quad \frac{}{s : a^\perp \wp a^\perp \wp a; a, a^\perp, a \vdash} \text{LOAD} \\
 \frac{}{s : a^\perp \wp a^\perp \wp a; a^n, a, \wp_{n+1} a^\perp, a, a^n \vdash} \text{SPLIT} \quad \frac{}{a^\perp, a \vdash} \text{Ax} \quad \frac{}{a^\perp, a \vdash} \text{Ax} \\
 \frac{}{s : a^\perp \wp a^\perp \wp a; a^n, a, \wp_{n+1} a^\perp, a^{n+1} \vdash} \otimes \quad \frac{}{a^\perp, a \vdash} \text{Ax} \quad \frac{}{a^\perp, a \vdash} \text{Ax} \\
 \frac{}{s : a^\perp \wp a^\perp \wp a; a^n, a, \wp_{n+1} a^\perp, \otimes_{n+1} a \vdash} \otimes \quad \frac{}{\wp_{n+1} a^\perp, a^n, a \vdash} \text{CUT} \\
 \frac{}{s : a^\perp \wp a^\perp \wp a; a^n, a^n, a, a, \wp_{n+1} a^\perp \vdash} \otimes \\
 \frac{}{s : a^\perp \wp a^\perp \wp a; a^n, \otimes_n a, a, a, \wp_{n+1} a^\perp \vdash} \otimes \\
 \frac{}{s : a^\perp \wp a^\perp \wp a; \otimes_n a, \otimes_n a, a, a, \wp_{n+1} a^\perp \vdash} \otimes \\
 \frac{}{s : a^\perp \wp a^\perp \wp a; (\otimes_n a)^{1+1}, a, a, \wp_{n+1} a^\perp \vdash} \text{SPLIT} \\
 \frac{}{s : a^\perp \wp a^\perp \wp a; (\otimes_n a)^{k+k}, a^k, a^k, \wp_k \wp_{n+1} a^\perp \vdash} \otimes \\
 \frac{}{s : a^\perp \wp a^\perp \wp a; \otimes_{k+k} \otimes_n a, a^k, a^k, \wp_k \wp_{n+1} a^\perp \vdash} \otimes
 \end{array}$$

## More complicated example: stencil (10)

$$\begin{array}{c}
 \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a^\perp, a \vdash} \text{AY} \quad \frac{}{a^\perp, a \vdash} \text{AY} \quad \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a^\perp, a \vdash} \text{AY} \quad \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a^\perp, a \vdash} \text{AY} \\
 \hline
 \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{a, a^\perp \vdash \quad a^\perp, a \vdash}{a, a^\perp, a^\perp \text{ AY } a \vdash} \text{AY} \quad \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{a, a^\perp \vdash \quad a^\perp, a \vdash}{a, a^\perp, a^\perp \text{ AY } a \vdash} \text{AY} \\
 \hline
 \frac{a, a, a^\perp, a^\perp \text{ AY } a^\perp \text{ AY } a \vdash}{s : a^\perp \text{ AY } a^\perp \text{ AY } a; a, a, a^\perp \vdash} \text{LOAD} \quad \frac{a, a, a^\perp, a^\perp \text{ AY } a^\perp \text{ AY } a \vdash}{s : a^\perp \text{ AY } a^\perp \text{ AY } a; a, a, a^\perp \vdash} \text{LOAD} \\
 \hline
 \frac{s : a^\perp \text{ AY } a^\perp \text{ AY } a; a, a, a^\perp \vdash}{s : a^\perp \text{ AY } a^\perp \text{ AY } a; a, a^n, a^n, a, \text{AY}_{n+1} a^\perp \vdash} \text{SPLIT} \\
 \frac{s : a^\perp \text{ AY } a^\perp \text{ AY } a; a^n, a^n, a, \text{AY}_{n+1} a^\perp \vdash}{s : a^\perp \text{ AY } a^\perp \text{ AY } a; a^{n+1}, a^n, a, \text{AY}_{n+1} a^\perp \vdash} \text{MERGE}_n \\
 \hline
 \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{a, a^\perp \vdash}{s : a^\perp \text{ AY } a^\perp \text{ AY } a; a, a^n, a^n, a, \text{AY}_{n+1} a^\perp \vdash} \text{CUT}_n \\
 \hline
 \frac{a, a^\perp \vdash}{s : a^\perp \text{ AY } a^\perp \text{ AY } a; a, a^n, a^n, a, \text{AY}_{n+1} a^\perp \vdash} \text{CUT} \\
 \hline
 \frac{s : a^\perp \text{ AY } a^\perp \text{ AY } a; a^n, a^n, a, a, \text{AY}_{n+1} a^\perp \vdash}{s : a^\perp \text{ AY } a^\perp \text{ AY } a; a^n, \otimes_n a, a, a, \text{AY}_{n+1} a^\perp \vdash} \otimes \\
 \frac{s : a^\perp \text{ AY } a^\perp \text{ AY } a; a^n, \otimes_n a, a, a, \text{AY}_{n+1} a^\perp \vdash}{s : a^\perp \text{ AY } a^\perp \text{ AY } a; \otimes_n a, \otimes_n a, a, a, \text{AY}_{n+1} a^\perp \vdash} \otimes \\
 \frac{s : a^\perp \text{ AY } a^\perp \text{ AY } a; \otimes_n a, \otimes_n a, a, a, \text{AY}_{n+1} a^\perp \vdash}{s : a^\perp \text{ AY } a^\perp \text{ AY } a; (\otimes_n a)^{1+1}, a, a, \text{AY}_{n+1} a^\perp \vdash} \text{SPLIT} \\
 \frac{s : a^\perp \text{ AY } a^\perp \text{ AY } a; (\otimes_n a)^{1+1}, a, a, \text{AY}_{n+1} a^\perp \vdash}{s : a^\perp \text{ AY } a^\perp \text{ AY } a; (\otimes_n a)^{k+k}, a^k, a^k, \text{AY}_k \text{AY}_{n+1} a^\perp \vdash} \text{AY} \\
 \frac{s : a^\perp \text{ AY } a^\perp \text{ AY } a; (\otimes_n a)^{k+k}, a^k, a^k, \text{AY}_k \text{AY}_{n+1} a^\perp \vdash}{s : a^\perp \text{ AY } a^\perp \text{ AY } a; \otimes_{k+k} \otimes_n a, a^k, a^k, \text{AY}_k \text{AY}_{n+1} a^\perp \vdash} \otimes
 \end{array}$$

## More complicated example: stencil (11)

$$\begin{array}{c}
 \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a, a^\perp \vdash} \text{AX} \\
 \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{a, a^\perp \vdash \quad a^\perp, a \vdash}{a, a^\perp, a^\perp \wp a \vdash} \text{AX} \quad \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{a, a^\perp \vdash \quad a^\perp, a \vdash}{a, a^\perp, a^\perp \wp a \vdash} \text{AX} \\
 \frac{a, a, a^\perp, a^\perp \wp a^\perp \wp a \vdash}{s : a^\perp \wp a^\perp \wp a; a, a, a^\perp \vdash} \text{LOAD} \quad \frac{a, a, a^\perp, a^\perp \wp a^\perp \wp a \vdash}{s : a^\perp \wp a^\perp \wp a; a, a, a^\perp \vdash} \text{LOAD} \\
 \frac{s : a^\perp \wp a^\perp \wp a; a, a, a^\perp \vdash \quad s : a^\perp \wp a^\perp \wp a; a^n, a, a^n, a, \wp_{n+1} a^\perp \vdash}{s : a^\perp \wp a^\perp \wp a; a, a^{n-1}, a, a^n, a, \wp_{n+1} a^\perp \vdash} \text{MERGE}_{n-1} \\
 \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{a, a^\perp \vdash \quad s : a^\perp \wp a^\perp \wp a; a^n, a, a^n, a, \wp_{n+1} a^\perp \vdash}{s : a^\perp \wp a^\perp \wp a; a^n, a, a^n, a, \wp_{n+1} a^\perp \vdash} \text{SPLIT} \\
 \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{a, a^\perp \vdash \quad s : a^\perp \wp a^\perp \wp a; a^n, a, a^n, a, \wp_{n+1} a^\perp \vdash}{s : a^\perp \wp a^\perp \wp a; a^n, a^n, a, a, \wp_{n+1} a^\perp \vdash} \text{CUT}_n \\
 \frac{s : a^\perp \wp a^\perp \wp a; a^n, a^n, a, a, \wp_{n+1} a^\perp \vdash}{s : a^\perp \wp a^\perp \wp a; a^n, \otimes_n a, a, a, \wp_{n+1} a^\perp \vdash} \otimes \\
 \frac{s : a^\perp \wp a^\perp \wp a; \otimes_n a, \otimes_n a, a, a, \wp_{n+1} a^\perp \vdash}{s : a^\perp \wp a^\perp \wp a; (\otimes_n a)^{1+1}, a, a, \wp_{n+1} a^\perp \vdash} \otimes \\
 \frac{s : a^\perp \wp a^\perp \wp a; (\otimes_n a)^{1+1}, a, a, \wp_{n+1} a^\perp \vdash}{s : a^\perp \wp a^\perp \wp a; (\otimes_n a)^{k+k}, a^k, a^k, \wp_k \wp_{n+1} a^\perp \vdash} \text{SPLIT} \\
 \frac{s : a^\perp \wp a^\perp \wp a; (\otimes_n a)^{k+k}, a^k, a^k, \wp_k \wp_{n+1} a^\perp \vdash}{s : a^\perp \wp a^\perp \wp a; \otimes_{k+k} a, a^k, a^k, \wp_k \wp_{n+1} a^\perp \vdash} \otimes
 \end{array}$$



# More complicated example: stencil (13)

$$\begin{array}{c}
 \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a^\perp, a \vdash} \text{AX} \quad \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a^\perp, a \vdash} \text{AX} \quad \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{}{a^\perp, a \vdash} \text{AX} \\
 \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{a, a^\perp \vdash \quad a^\perp, a \vdash}{a, a^\perp, a^\perp \wp a \vdash} \text{LOAD} \quad \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{a, a^\perp \vdash \quad a^\perp, a \vdash}{a, a^\perp, a^\perp \wp a \vdash} \text{LOAD} \quad \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{a, a^\perp \vdash \quad a^\perp, a \vdash}{a, a^\perp, a^\perp \wp a \vdash} \text{LOAD} \\
 \frac{a, a, a^\perp, a^\perp \wp a^\perp \wp a \vdash}{s : a^\perp \wp a^\perp \wp a; a, a, a^\perp \vdash} \text{LOAD} \quad \frac{a, a, a^\perp, a^\perp \wp a^\perp \wp a \vdash}{s : a^\perp \wp a^\perp \wp a; a, a, a^\perp \vdash} \text{LOAD} \quad \frac{a, a, a^\perp, a^\perp \wp a^\perp \wp a \vdash}{s : a^\perp \wp a^\perp \wp a; a, a, a^\perp \vdash} \text{LOAD} \\
 \frac{s : a^\perp \wp a^\perp \wp a; a, a, a^{n-1}, a^{n-1}, a, \wp_{n+1} a^\perp \vdash}{s : a^\perp \wp a^\perp \wp a; a, a, a^{n-1}, a^{n-1}, a, \wp_{n+1} a^\perp \vdash} \text{SPLIT}_{n-1} \\
 \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{s : a^\perp \wp a^\perp \wp a; a, a, a^{n-1}, a^n, a, \wp_{n+1} a^\perp \vdash}{s : a^\perp \wp a^\perp \wp a; a, a^n, a^n, \wp_{n+1} a^\perp \vdash} \text{SPLIT} \\
 \frac{}{a, a^\perp \vdash} \text{AX} \quad \frac{s : a^\perp \wp a^\perp \wp a; a^n, a^n, a, a, \wp_{n+1} a^\perp \vdash}{s : a^\perp \wp a^\perp \wp a; a^n, \otimes_n a, a, a, \wp_{n+1} a^\perp \vdash} \text{CUT} \\
 \frac{s : a^\perp \wp a^\perp \wp a; a^n, a^n, a, a, \wp_{n+1} a^\perp \vdash}{s : a^\perp \wp a^\perp \wp a; a^n, \otimes_n a, a, a, \wp_{n+1} a^\perp \vdash} \otimes \\
 \frac{s : a^\perp \wp a^\perp \wp a; \otimes_n a, \otimes_n a, a, a, \wp_{n+1} a^\perp \vdash}{s : a^\perp \wp a^\perp \wp a; \otimes_n a, \otimes_n a, a, a, \wp_{n+1} a^\perp \vdash} \otimes \\
 \frac{s : a^\perp \wp a^\perp \wp a; (\otimes_n a)^{1+1}, a, a, \wp_{n+1} a^\perp \vdash}{s : a^\perp \wp a^\perp \wp a; (\otimes_n a)^{1+1}, a, a, \wp_{n+1} a^\perp \vdash} \text{SPLIT} \\
 \frac{s : a^\perp \wp a^\perp \wp a; (\otimes_n a)^{k+k}, a^k, a^k, \wp_k \wp_{n+1} a^\perp \vdash}{s : a^\perp \wp a^\perp \wp a; (\otimes_n a)^{k+k}, a^k, a^k, \wp_k \wp_{n+1} a^\perp \vdash} \wp \\
 \frac{s : a^\perp \wp a^\perp \wp a; (\otimes_{k+k} \otimes_n a, a^k, a^k, \wp_k \wp_{n+1} a^\perp \vdash}{s : a^\perp \wp a^\perp \wp a; \otimes_{k+k} \otimes_n a, a^k, a^k, \wp_k \wp_{n+1} a^\perp \vdash} \otimes
 \end{array}$$





Done!

# Even more complicated example: stencil fusion (0)



# Even more complicated example: stencil fusion (30)



# Even more complicated example: stencil fusion (60)



# Even more complicated example: stencil fusion (90)



# Even more complicated example: stencil fusion (120)







Why, oh why didn't I take the blue pill?





Why, oh why didn't I take the blue pill?

- ▶  $a^\perp = a \rightarrow \text{Effect } ()$
- ▶  $\otimes_n a = \text{Int} \rightarrow a$
- ▶  $\wp_n a = (\text{Int} \rightarrow a^\perp) \rightarrow \text{Effect } ()$

# Conclusion

- ▶ Reliable Fusion is of Utmost Importance
- ▶ Two important questions: Who is in control? How many copies do we need?
- ▶ CPS gives answer to to the 1st question
- ▶ Linear Logic gives answers to both questions, and is realized with linear types.

$$\frac{}{A, A^\perp \vdash} \text{Ax}$$

$$\frac{\Gamma, A^n \vdash \quad A^\perp, \Delta \vdash}{\Gamma, \Delta^n \vdash} \text{CUT}_n$$

$$\frac{}{\perp \vdash} \perp$$

$$\frac{\Gamma \vdash}{\Gamma, 1 \vdash} 1$$

$$\frac{}{\Gamma, 0 \vdash} 0$$

$$\frac{\Gamma, A, B \vdash}{\Gamma, A \otimes B \vdash} \otimes$$

$$\frac{\Gamma, A \vdash \quad B, \Delta \vdash}{\Gamma, A \wp B, \Delta \vdash} \wp$$

$$\frac{\Gamma, A, \Delta \vdash \quad \Gamma, B, \Delta \vdash}{\Gamma, A \oplus B, \Delta \vdash} \oplus$$

$$\frac{\Gamma, A \vdash}{\Gamma, A \& B \vdash} \&_1$$

$$\frac{\Gamma, B \vdash}{\Gamma, A \& B \vdash} \&_2$$

$$\frac{\Gamma, A[B] \vdash}{\Gamma, \forall \alpha. A[\alpha] \vdash} \forall$$

$$\frac{\Gamma, A[\beta] \vdash}{\Gamma, \exists \alpha. A[\alpha] \vdash} \exists$$

$$\frac{\Gamma, A^n, A^m \vdash}{\Gamma, A^{n+m} \vdash} \text{SPLIT}_n$$

$$\frac{A^{m+n}, \Gamma \vdash}{\Gamma, A^m, A^n \vdash} \text{MERGE}_m$$

$$\frac{\Gamma, A^m \vdash}{\Gamma, \bigotimes_m A \vdash} \otimes$$

$$\frac{\Gamma, A \vdash \quad \Delta, A \vdash}{\Gamma^n, \Delta^m, \wp_{n+m} A \vdash} \wp$$

$$\frac{\Gamma, A^{\perp n} \vdash \quad A^n, \Delta \vdash}{\Gamma, \Delta \vdash} \text{FREEZE}$$

$$\frac{B[0]^\perp, \Delta \vdash \quad B[k], B[k], B[k+1]^\perp \vdash \quad B[n], \Gamma \vdash}{n : \text{Ix}; \Gamma, \Delta^{2^n} \vdash} \text{FOLDMAP}$$