

The Compiler Forest

ESOP

March 19, 2013

Mihai Budiu, Microsoft Research, Silicon Valley

Joel Galenson, UC Berkeley

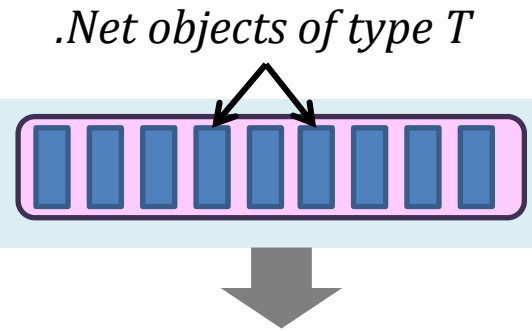
Gordon Plotkin, University of Edinburgh

Outline

- Motivating example
 - Declarative parallel programming with LINQ and DryadLINQ
- Divide-and-conquer compilation
 - Compilers and Partial Compilers
- Building real compilers
 - LINQ, DryadLINQ, and matrix computations

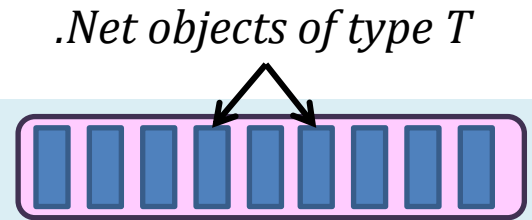
LINQ Summary

Input

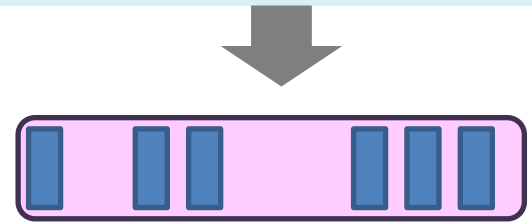


LINQ Summary

Input



Where (filter)



LINQ Summary

.Net objects of type T

Input



Where (filter)



Select (map)



LINQ Summary

.Net objects of type T

Input



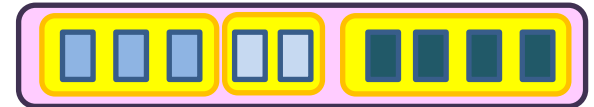
Where (filter)



Select (map)

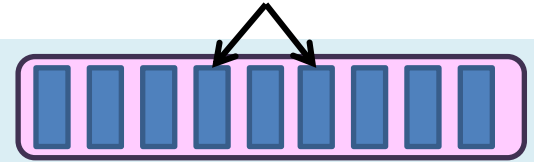


GroupBy



LINQ Summary

.Net objects of type T



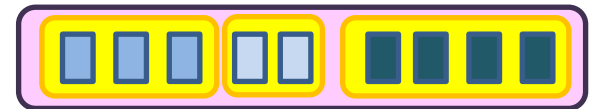
Input



Where (filter)



Select (map)



GroupBy



OrderBy (sort)

LINQ Summary

.Net objects of type T

Input



Where (filter)



Select (map)



GroupBy



OrderBy (sort)



Aggregate (fold)



LINQ Summary

.Net objects of type T



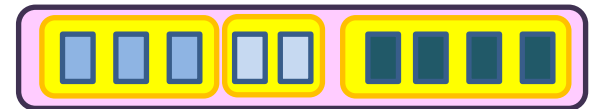
Input



Where (filter)



Select (map)



GroupBy

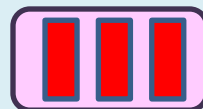


OrderBy (sort)

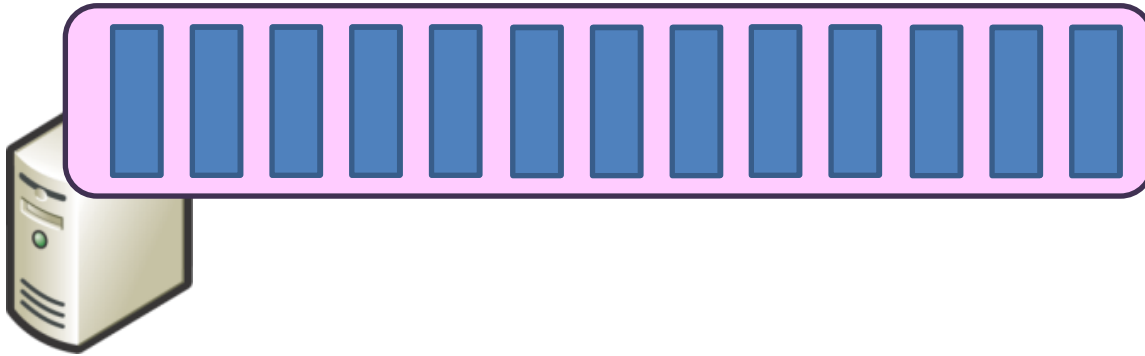


Aggregate (fold)

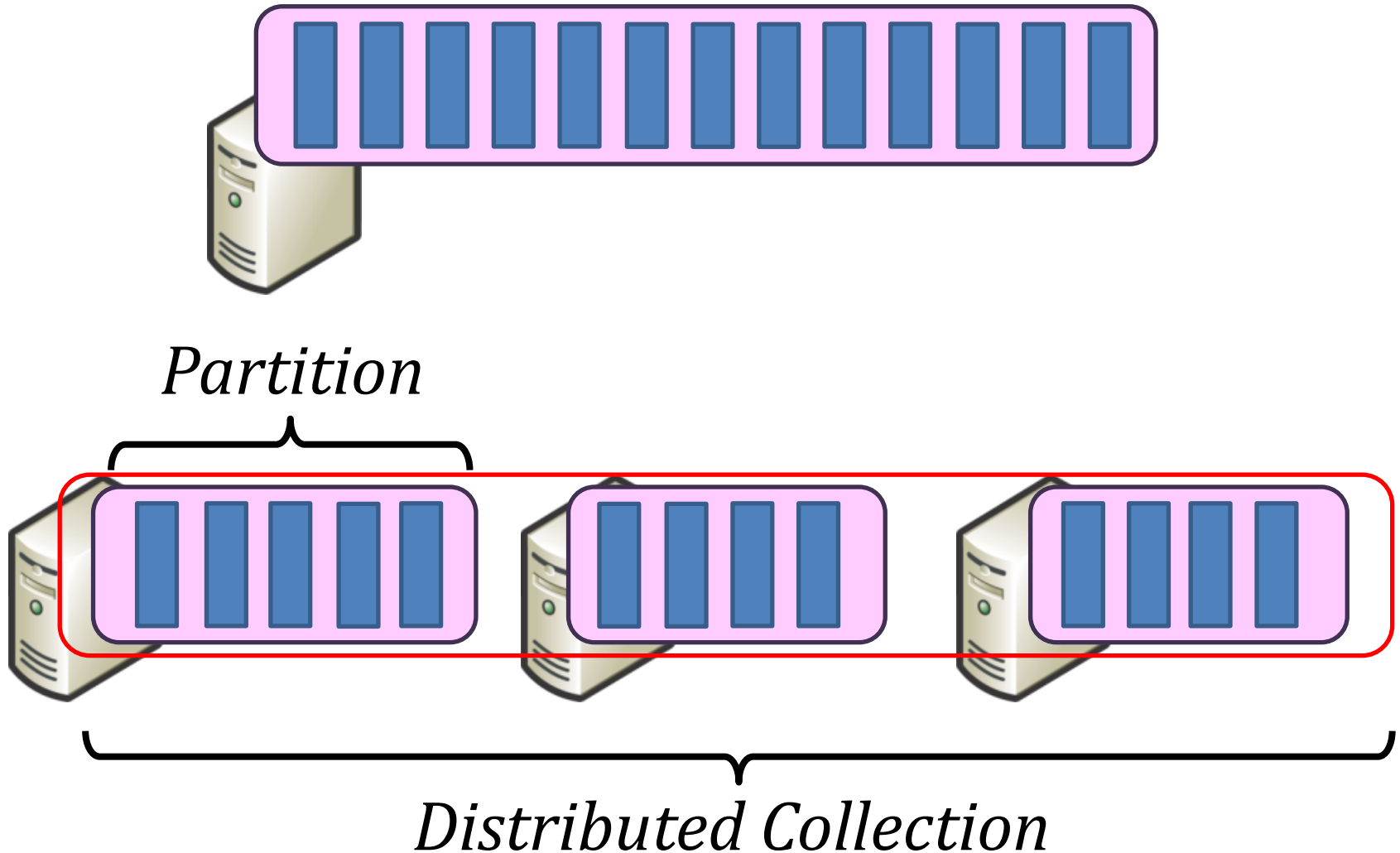
Join



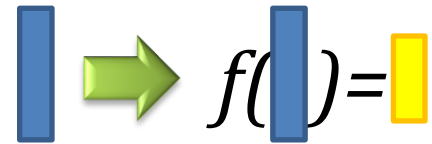
Distributed Collections



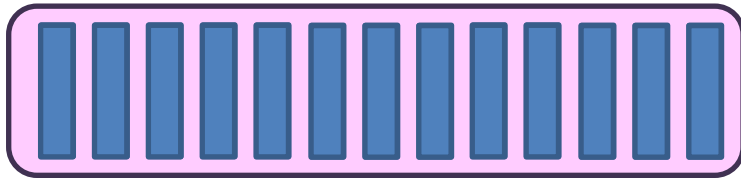
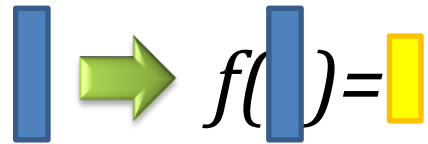
Distributed Collections



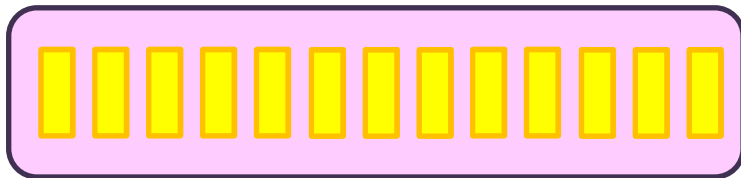
Select (Map)



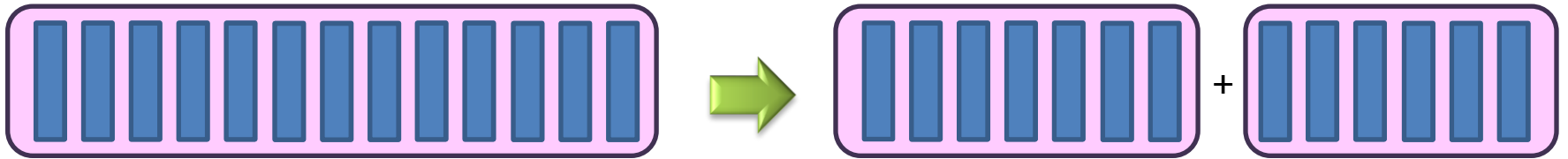
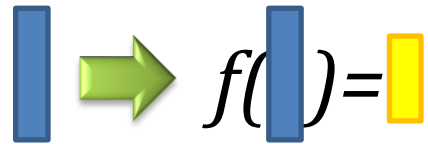
Select (Map)



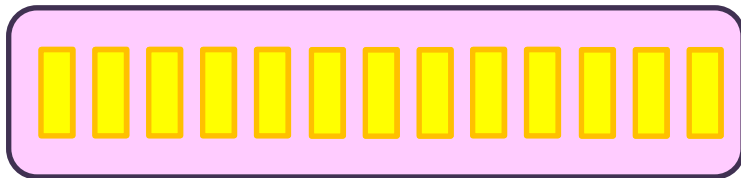
Select($x \Rightarrow f(x)$)



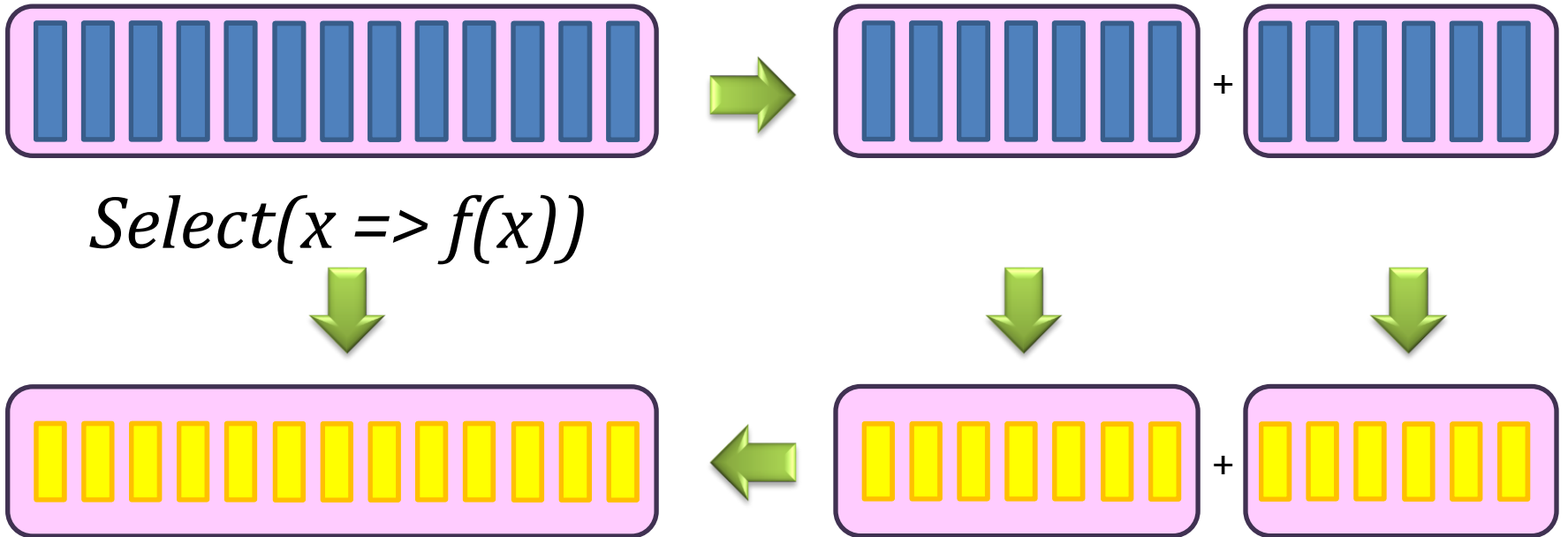
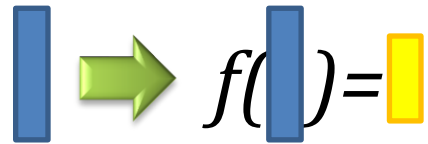
Select (Map)



Select(x => f(x))



Select (Map)



Aggregate (Fold)

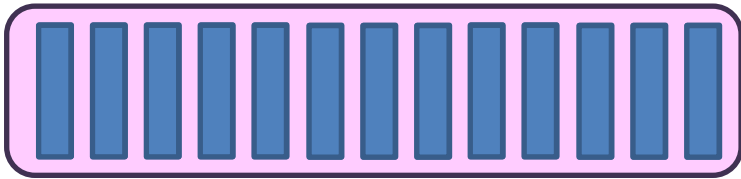
$$f(\text{█}, \text{█}) = \text{█}$$

associative

Aggregate (Fold)

$$f(\text{█}, \text{█}) = \text{█}$$

associative



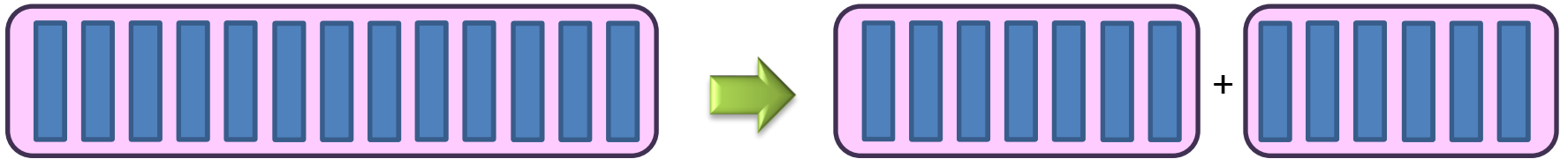
$Aggregate((x,y) \Rightarrow f(x,y))$



Aggregate (Fold)

$$f(\text{||}, \text{||}) = \text{||}$$

associative



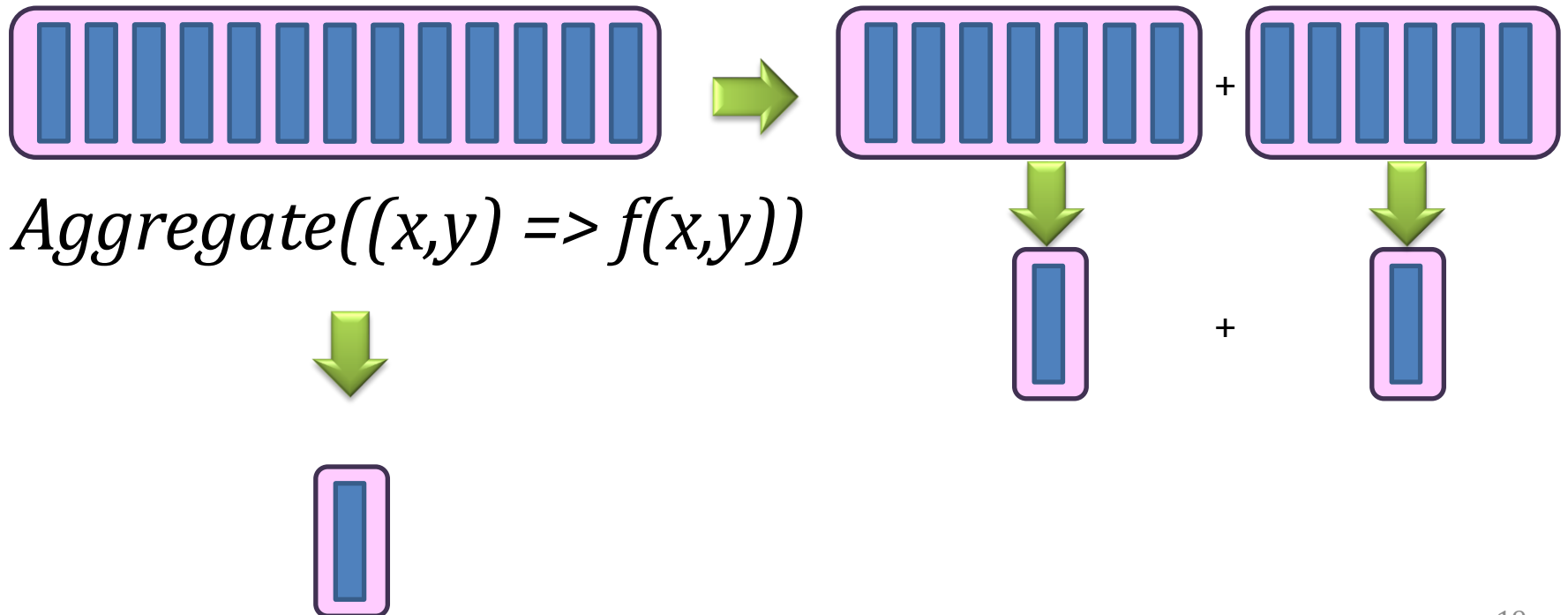
$Aggregate((x,y) \Rightarrow f(x,y))$



Aggregate (Fold)

$$f(\text{array}, \text{array}) = \text{array}$$

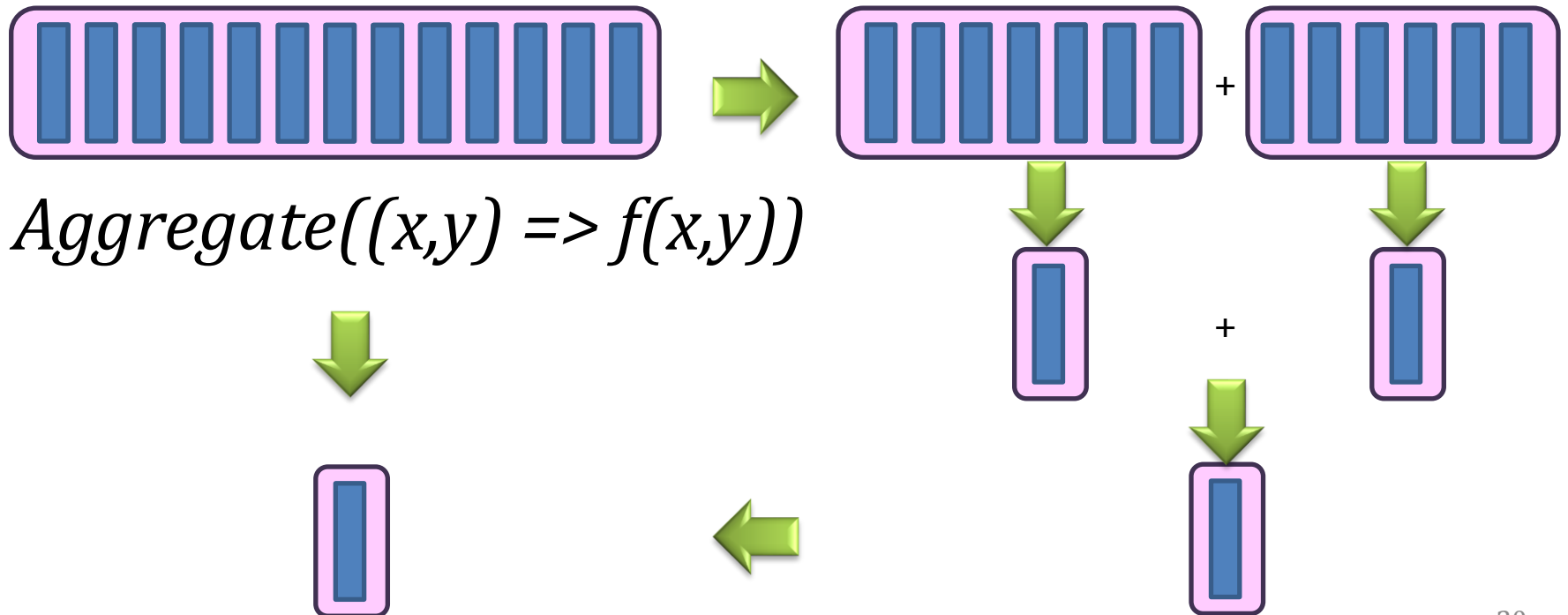
associative



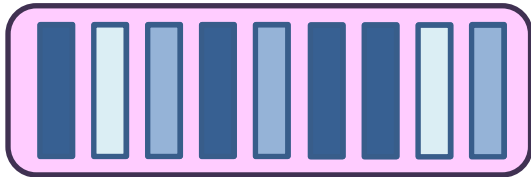
Aggregate (Fold)

$$f(\text{array}, \text{array}) = \text{array}$$

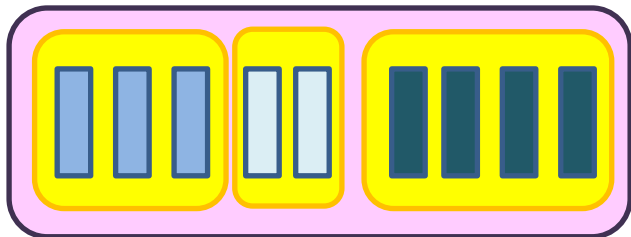
associative



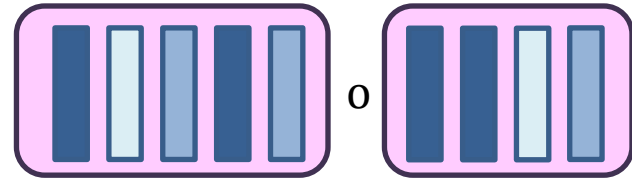
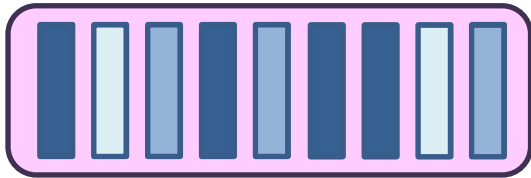
GroupBy



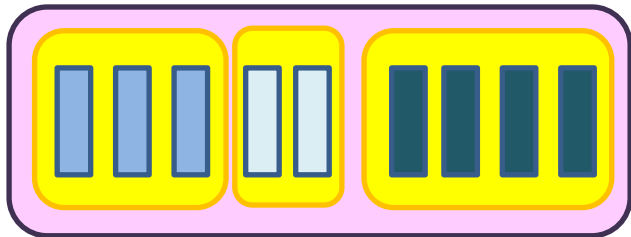
GroupBy($x \Rightarrow K(x)$)



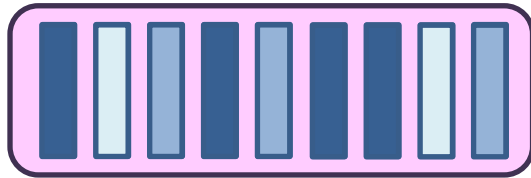
GroupBy



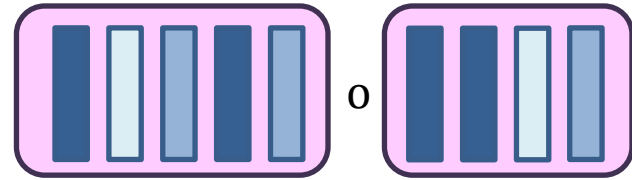
GroupBy($x \Rightarrow K(x)$)



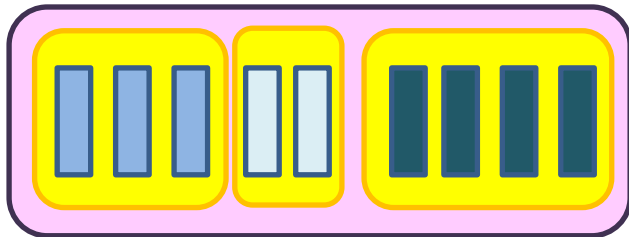
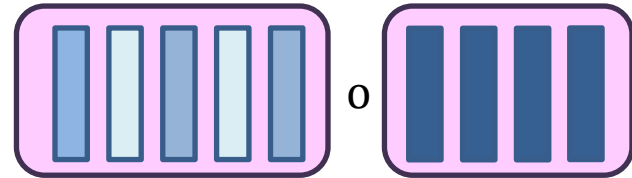
GroupBy



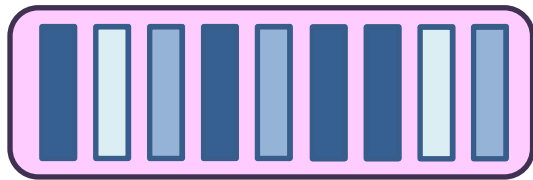
GroupBy($x \Rightarrow K(x)$)



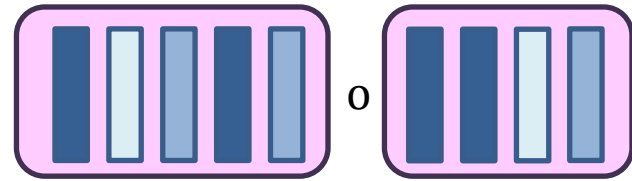
PartitionBy($x \Rightarrow K(x)$)



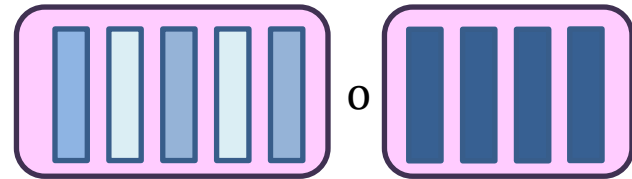
GroupBy



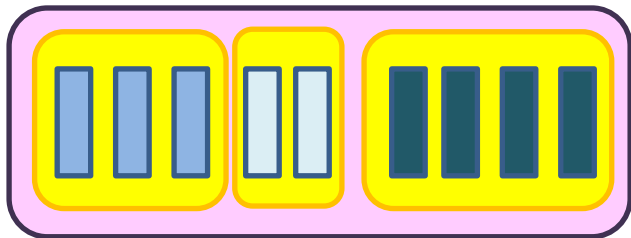
GroupBy($x \Rightarrow K(x)$)



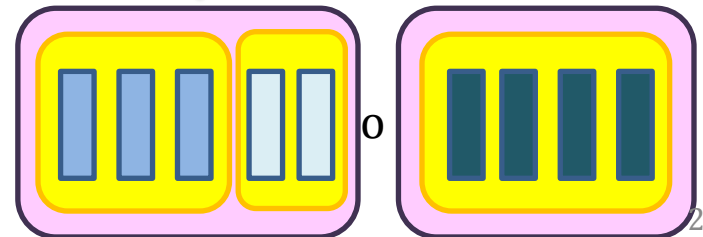
PartitionBy($x \Rightarrow K(x)$)



GroupBy($x \Rightarrow K(x)$)



*Equal under
permutation*

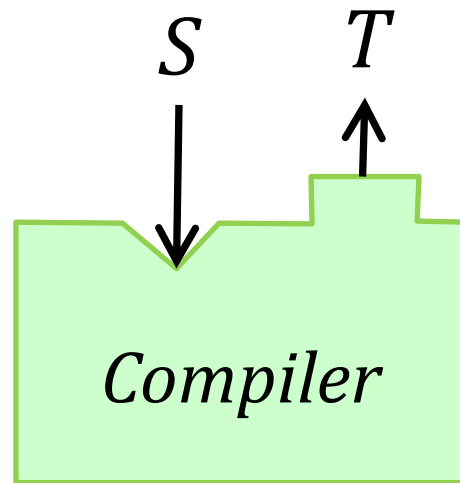


Outline



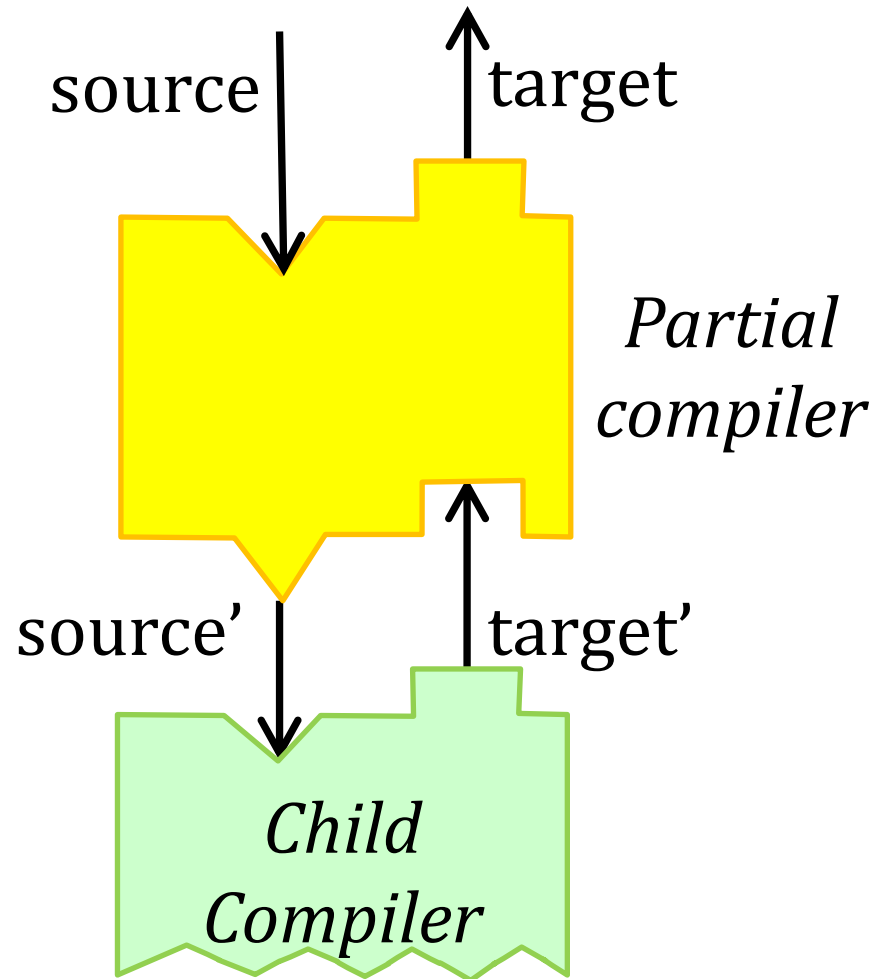
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Compilers

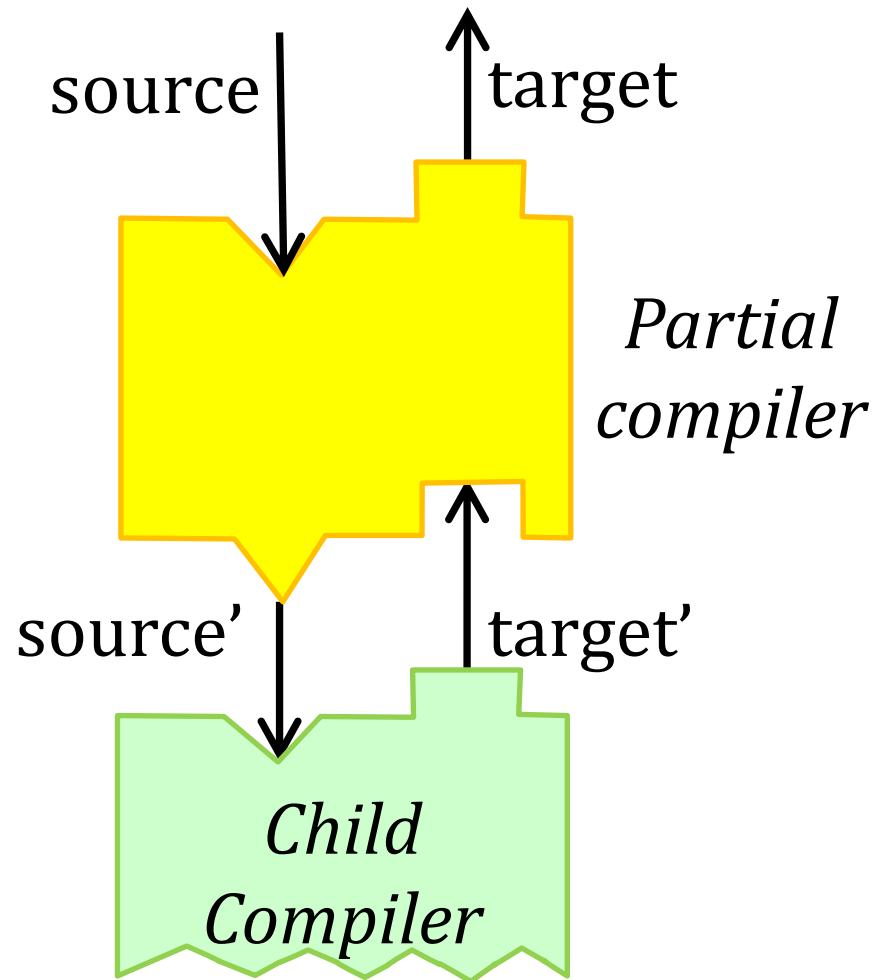


$C : \text{source} \rightarrow \text{target}$

Partial compilers

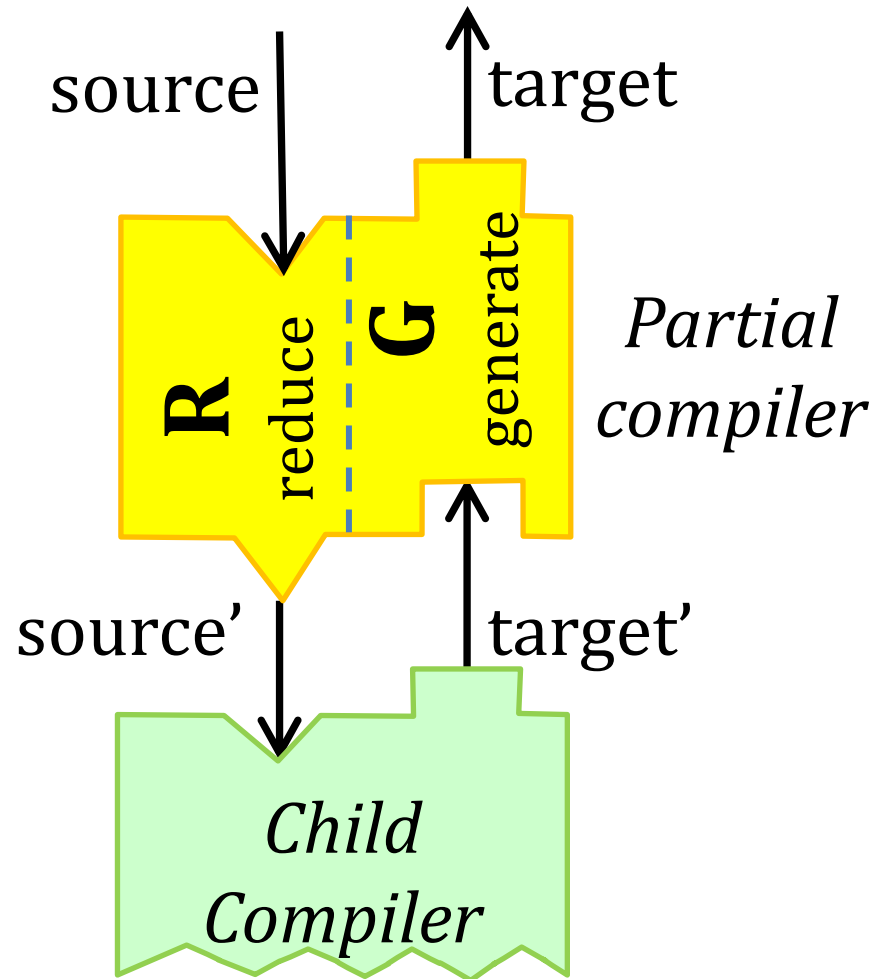


Partial compilers



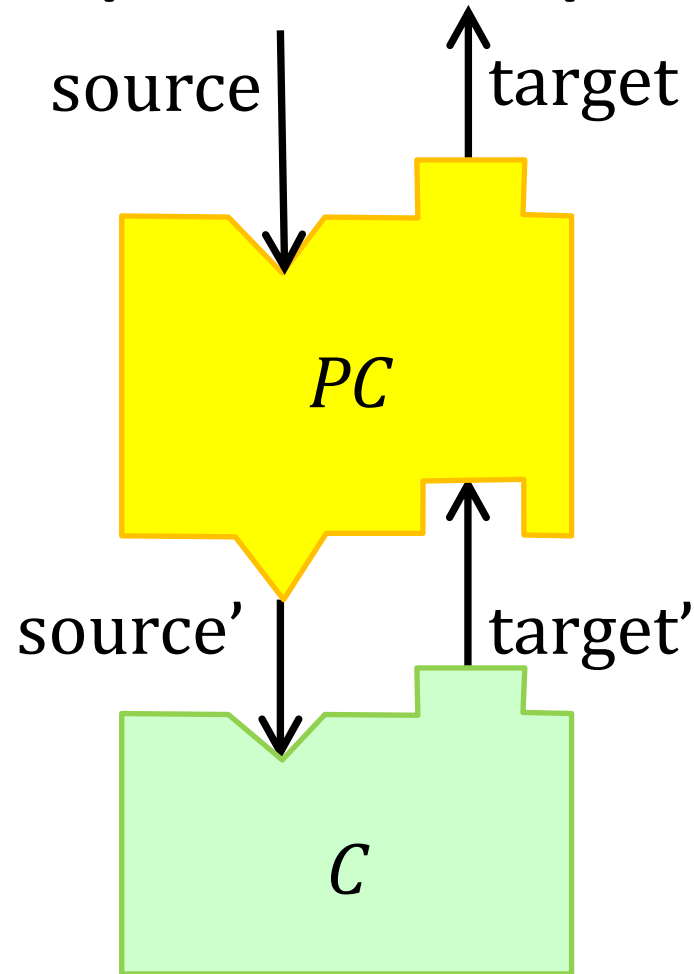
$$PC : \text{source} \rightarrow (\text{source}' \times (\text{target}' \rightarrow \text{target}))$$

Partial compilers

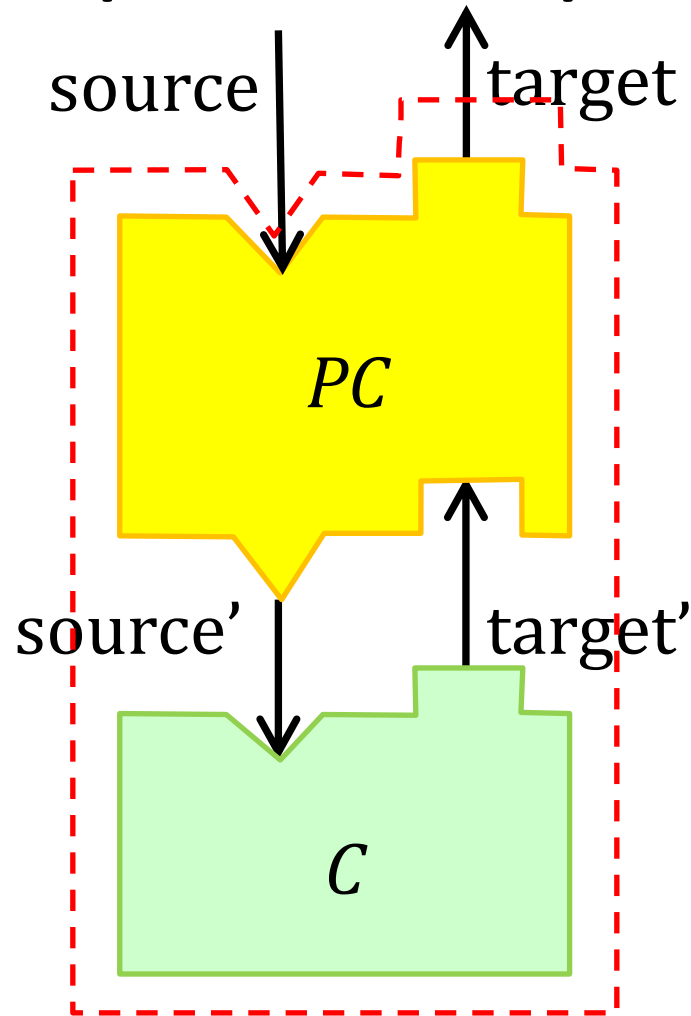


$$PC : \text{source} \rightarrow (\text{source}' \times (\text{target}' \rightarrow \text{target}))$$

Compiler Composition



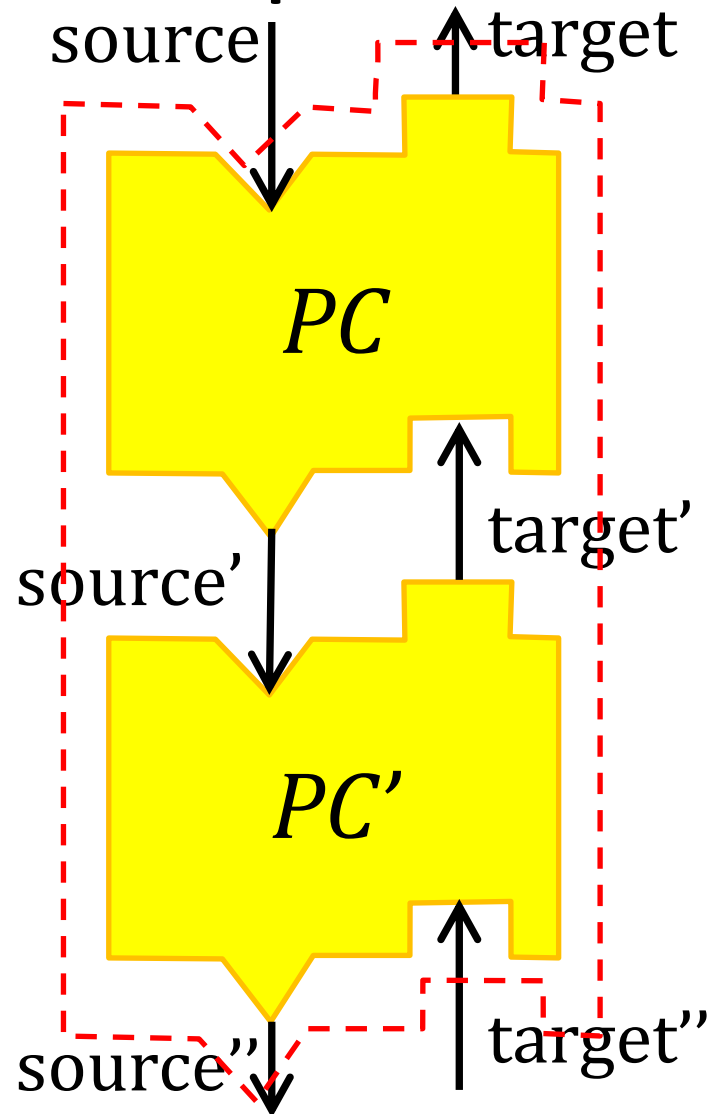
Compiler Composition



$PC \ll C \gg : \text{source} \rightarrow \text{target}$

$\lambda S : \text{source. let } (S', G) \text{ be } PC(S) \text{ in } G(C(S'))$

Partial Compiler Composition



Composition Laws

$$PC \langle\langle PC' \langle\langle PC'' \rangle\rangle\rangle = PC \langle\langle PC' \rangle\rangle \langle\langle PC'' \rangle\rangle$$

$$PC \langle\langle PC' \langle\langle C \rangle\rangle\rangle = PC \langle\langle PC' \rangle\rangle \langle\langle C \rangle\rangle$$

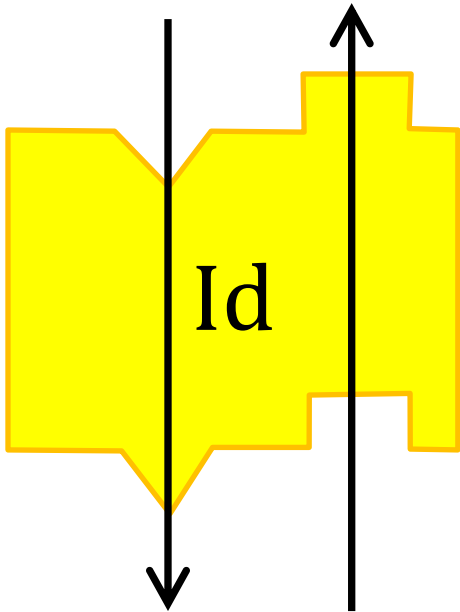
Composition Laws

$$PC \langle\langle PC' \langle\langle PC'' \rangle\rangle\rangle = PC \langle\langle PC' \rangle\rangle \langle\langle PC'' \rangle\rangle$$

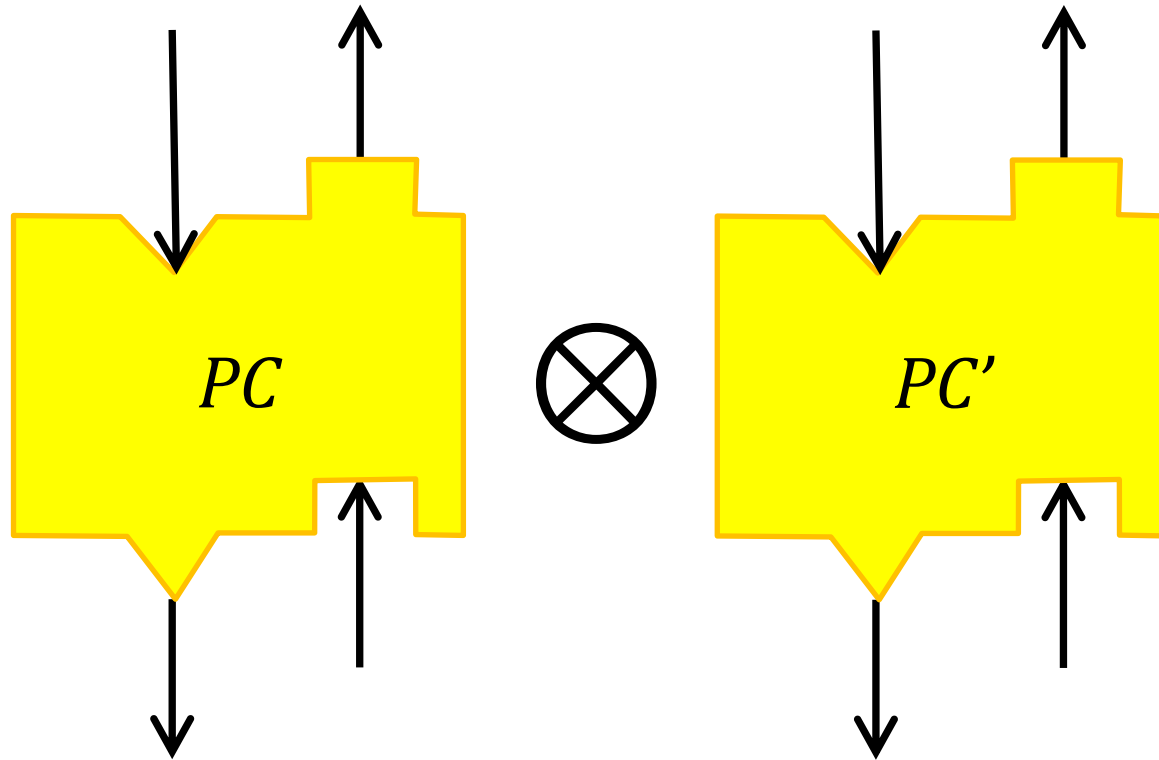
$$PC \langle\langle PC' \langle\langle C \rangle\rangle\rangle = PC \langle\langle PC' \rangle\rangle \langle\langle C \rangle\rangle$$

$$\text{Id} \langle\langle PC \rangle\rangle = PC = PC \langle\langle \text{Id} \rangle\rangle$$

$$\text{Id} \langle\langle C \rangle\rangle = C$$

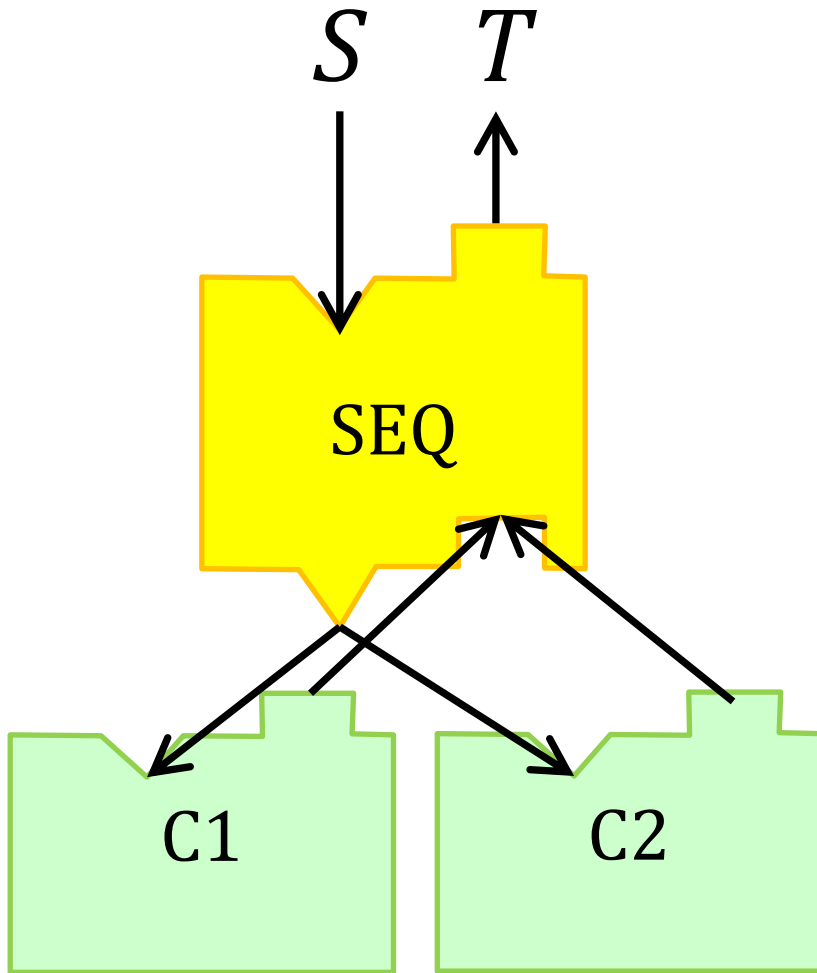


Compilers as First-Class Objects

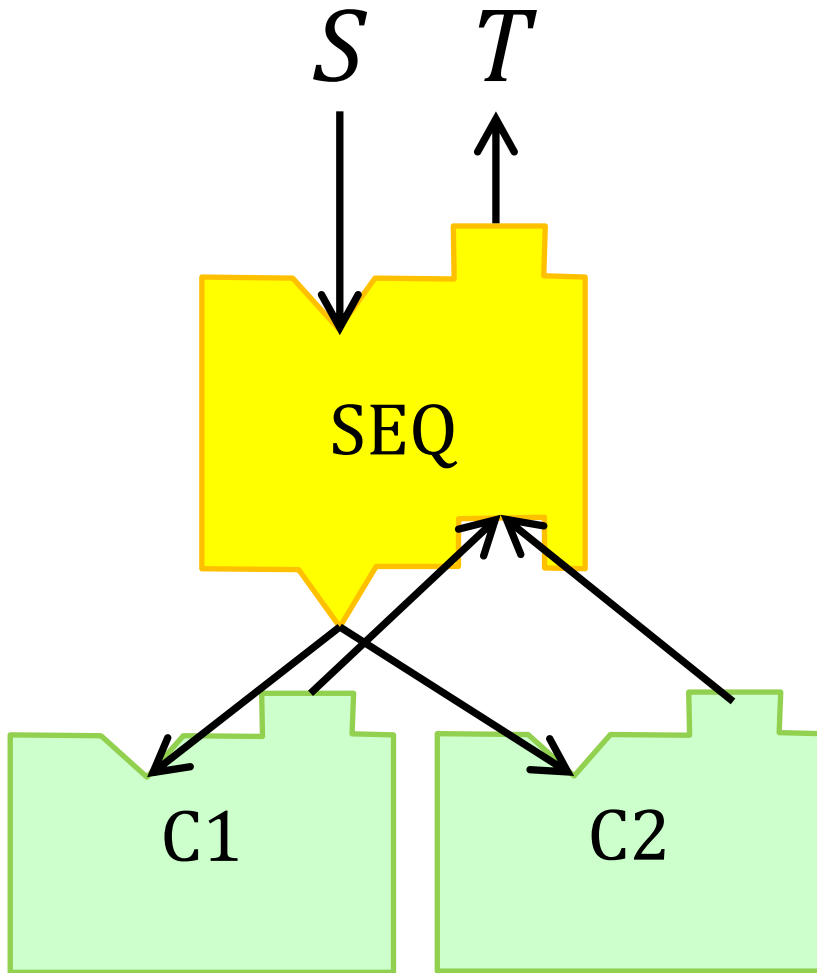


Tensor: $PC \otimes PC'$

Multiple Children



Multiple Children



Example:

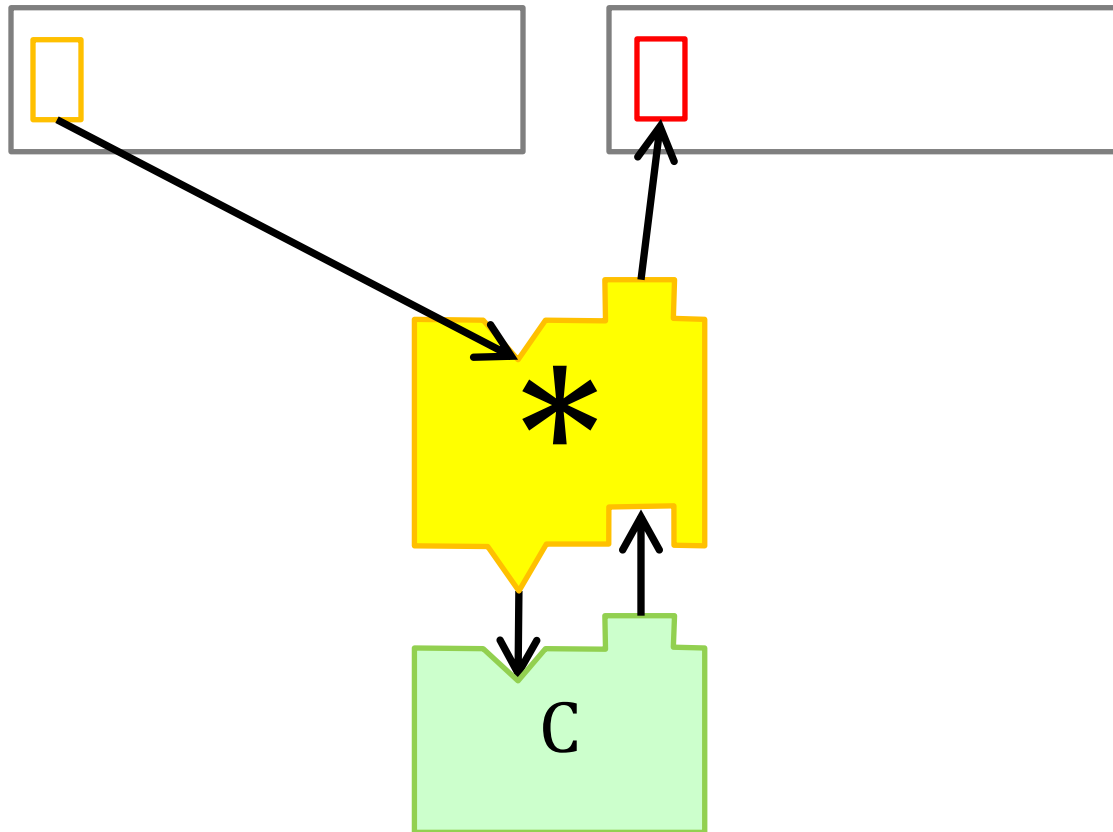
$$S = f \circ g$$

$$T = C1(f) \circ C2(g)$$

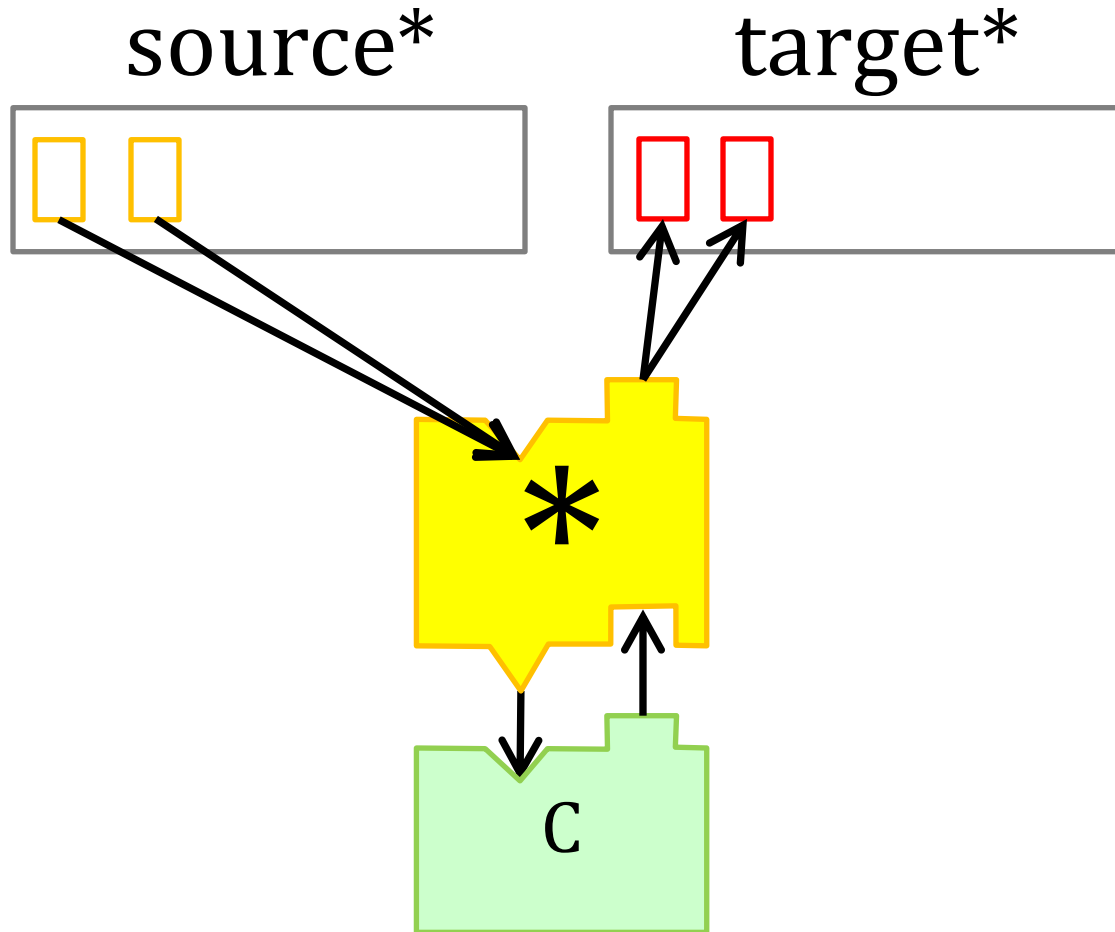
Star

source*

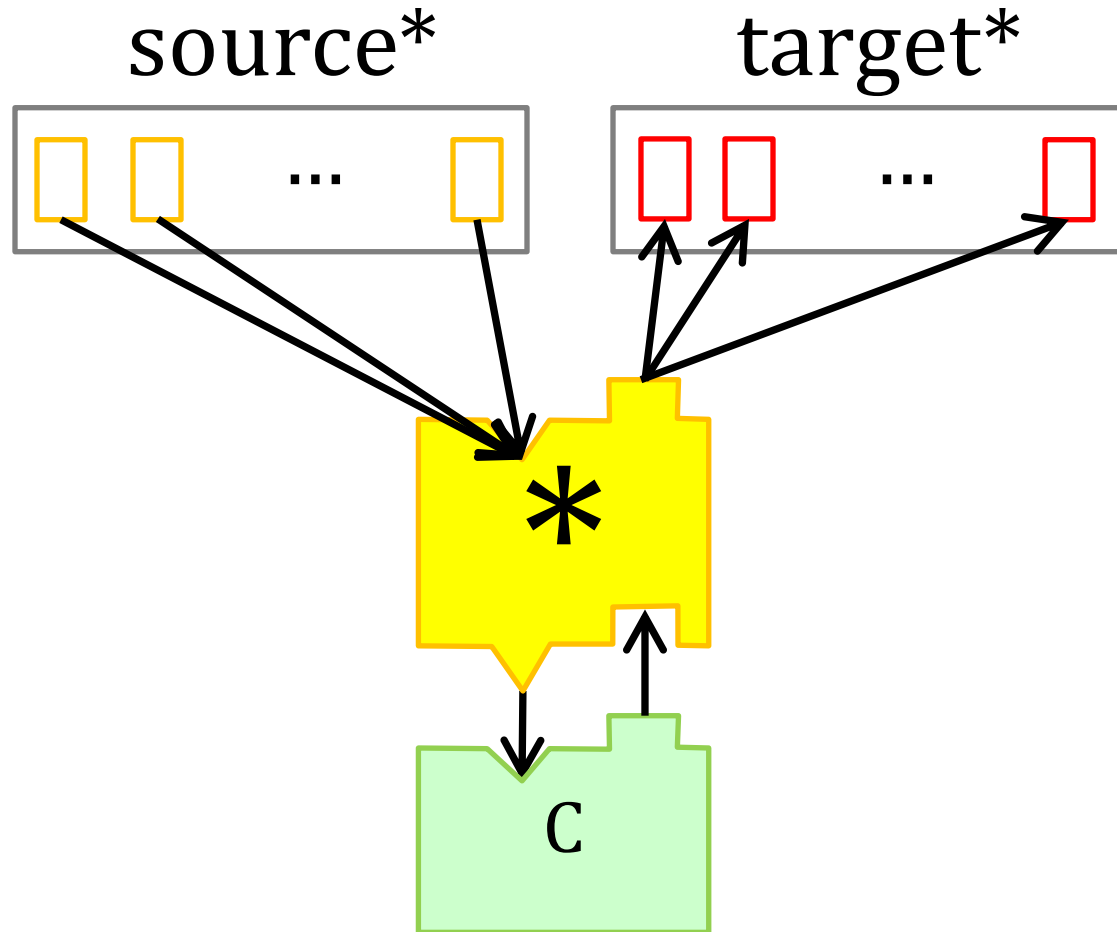
target*



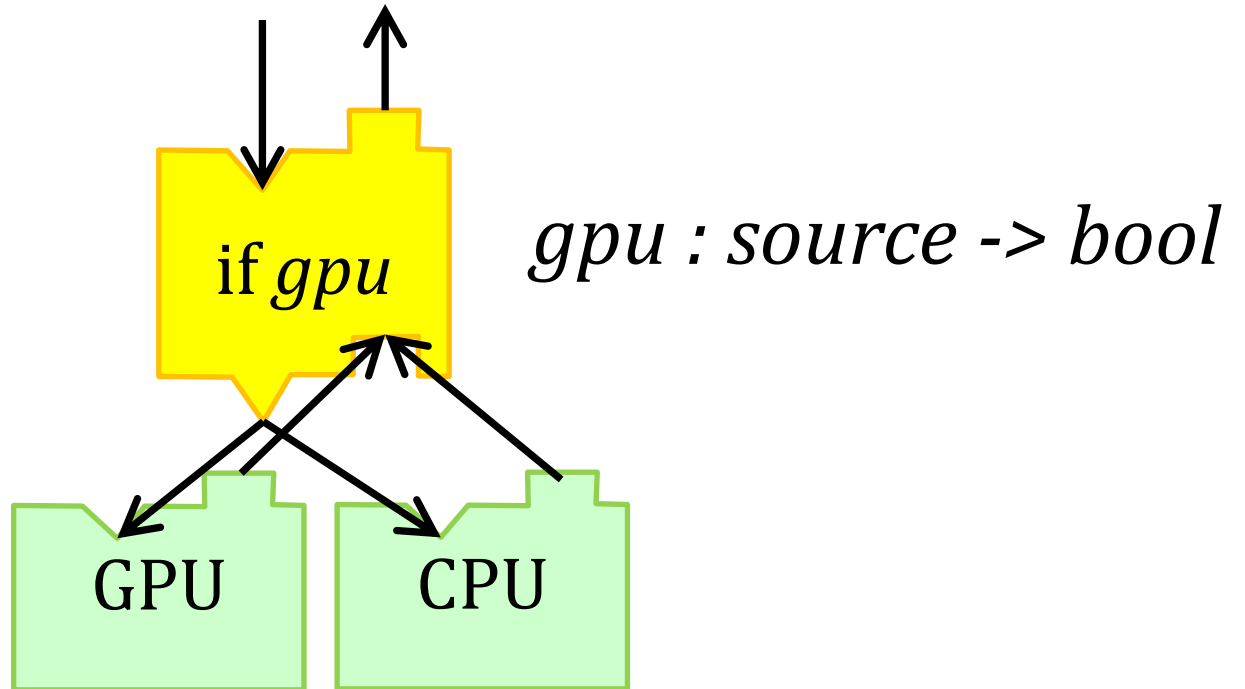
Star



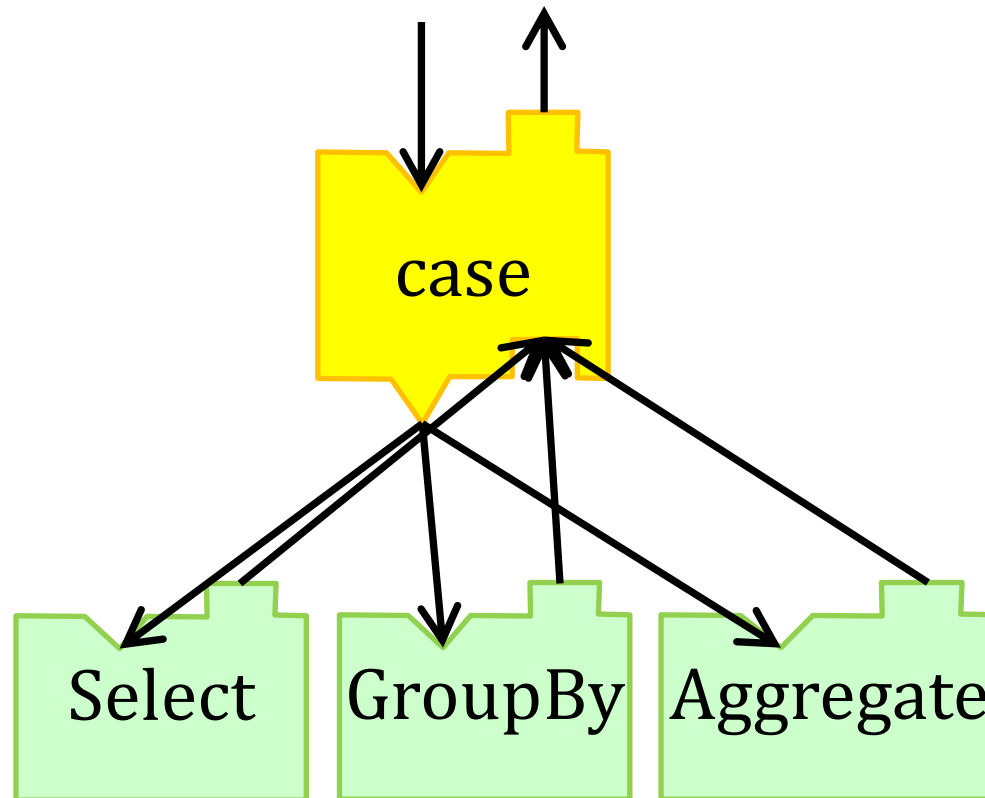
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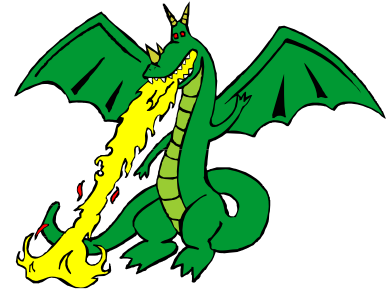
Conditional



Case

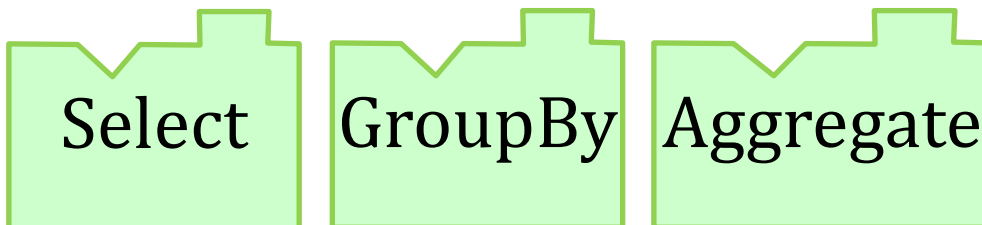


Outline

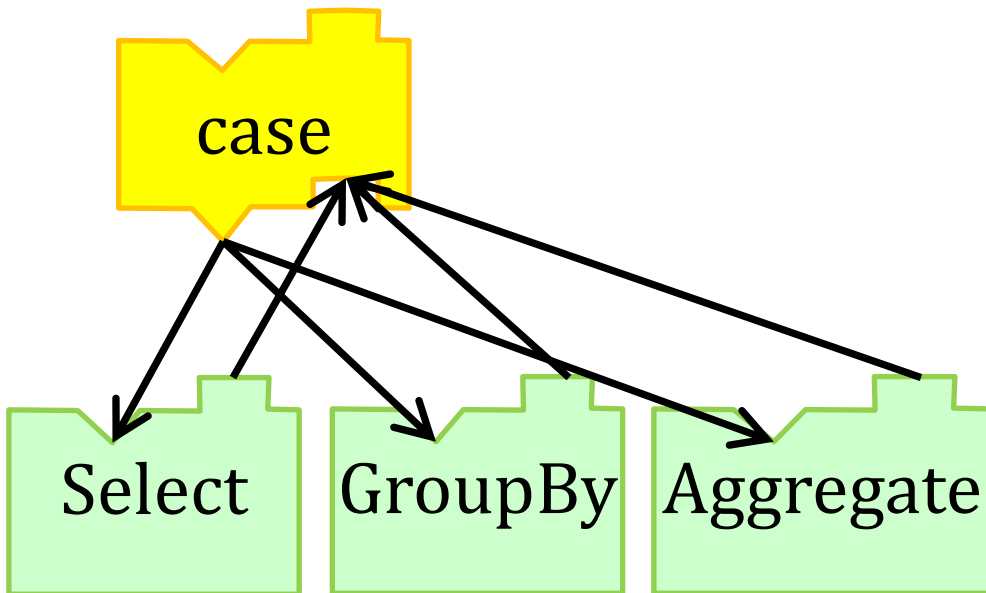


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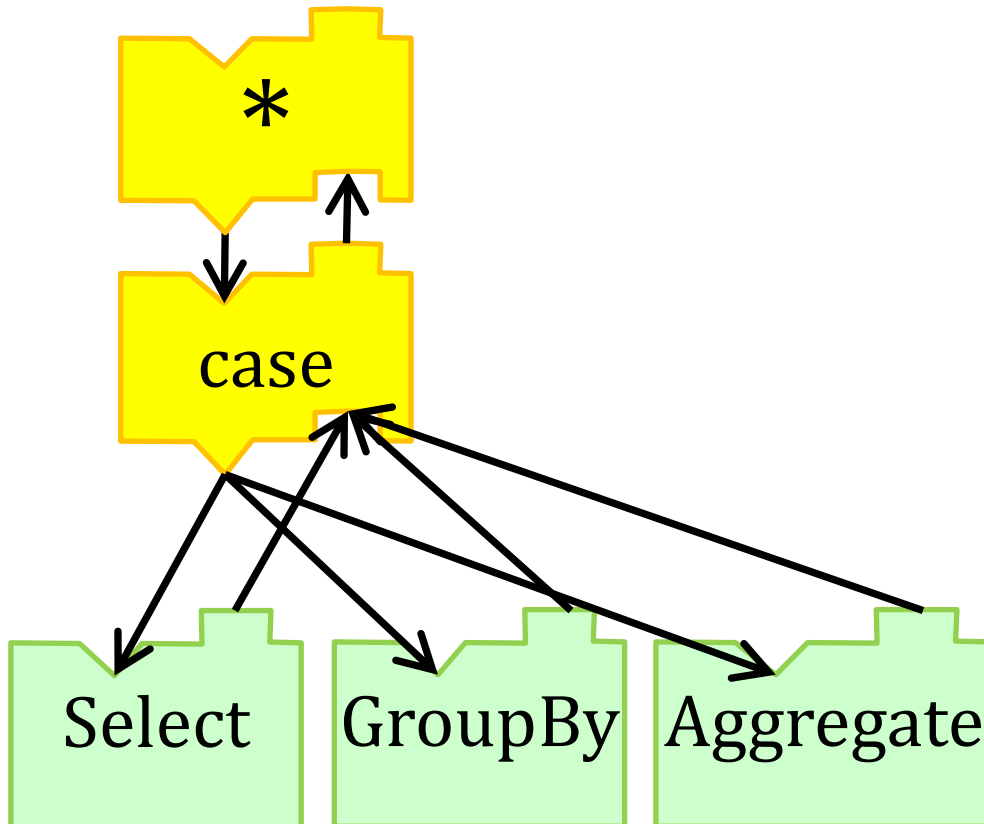
A LINQ Compiler



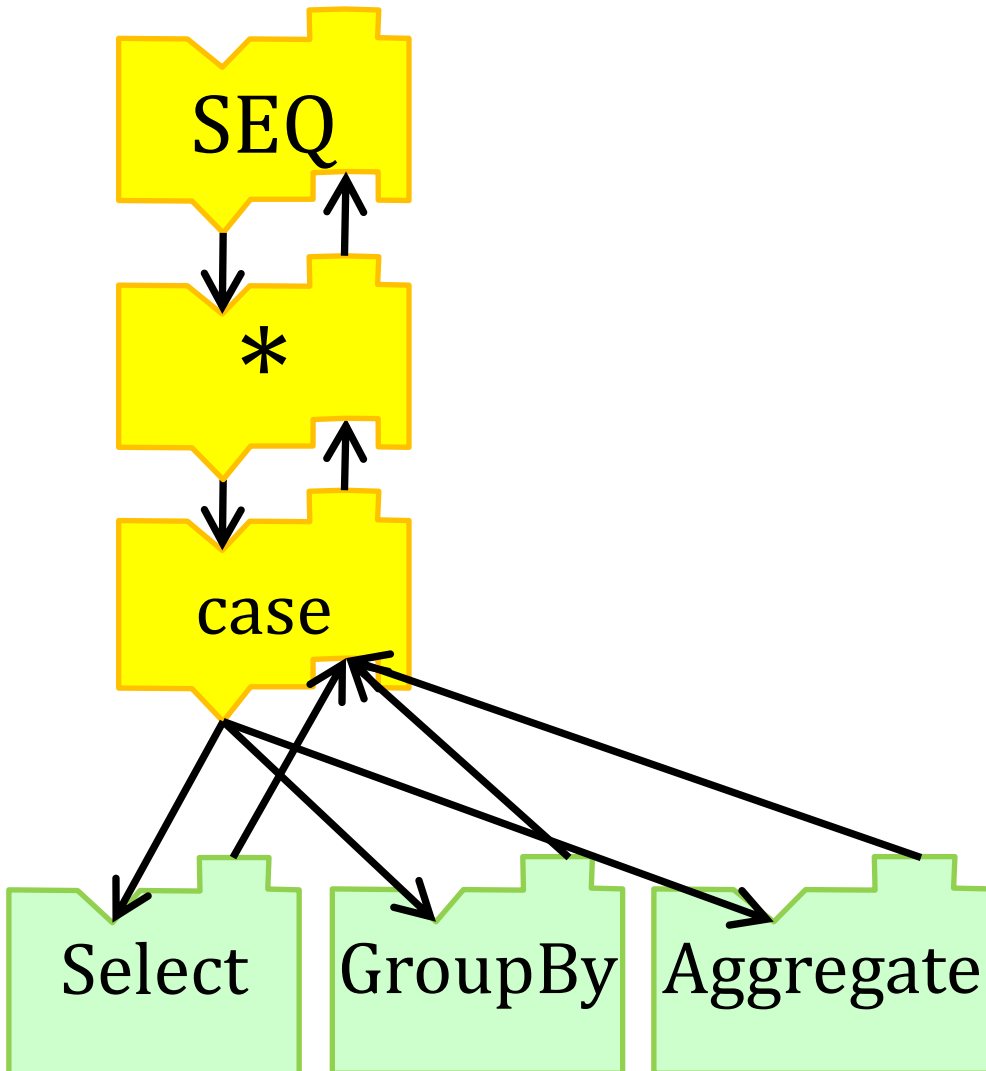
A LINQ Compiler



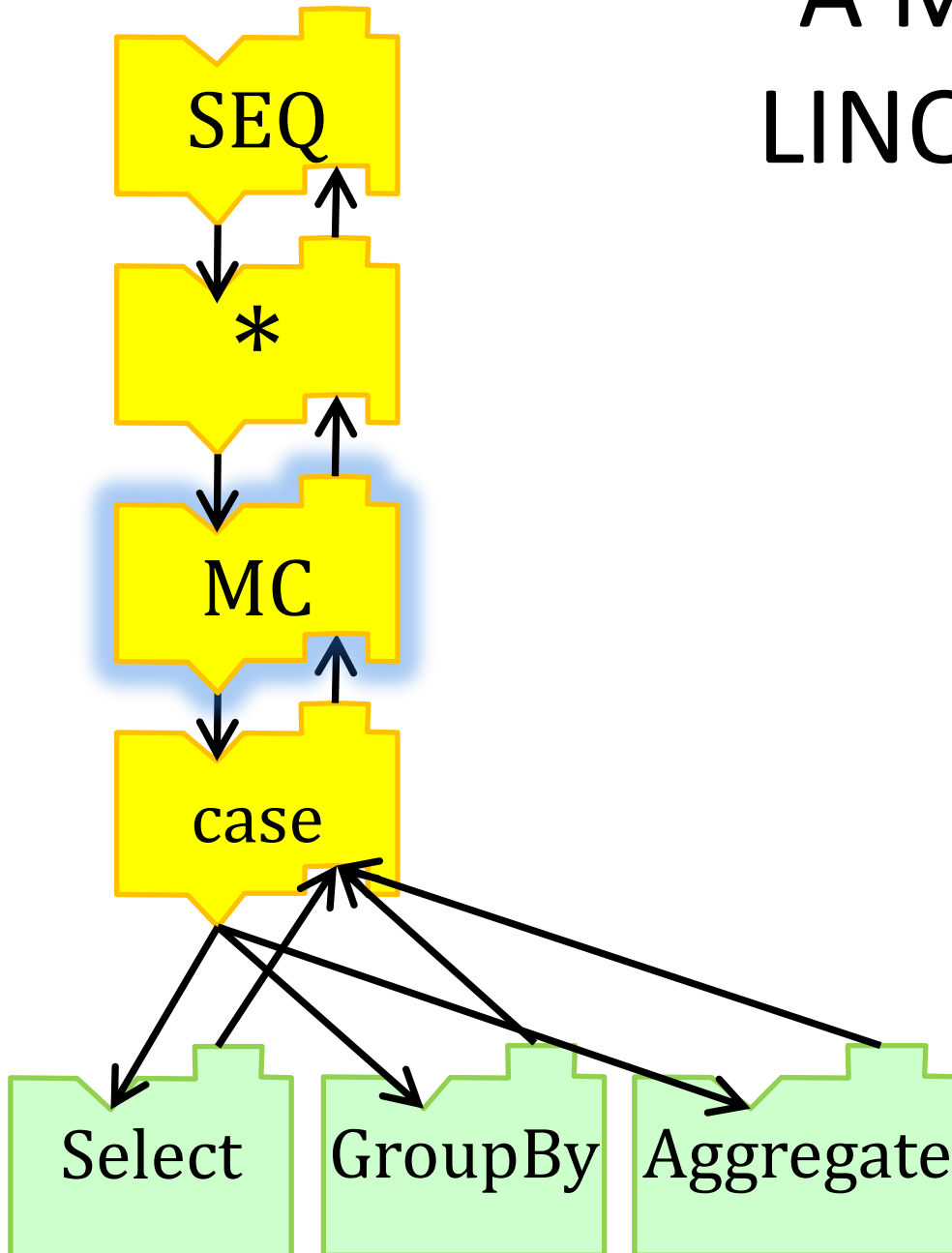
A LINQ Compiler



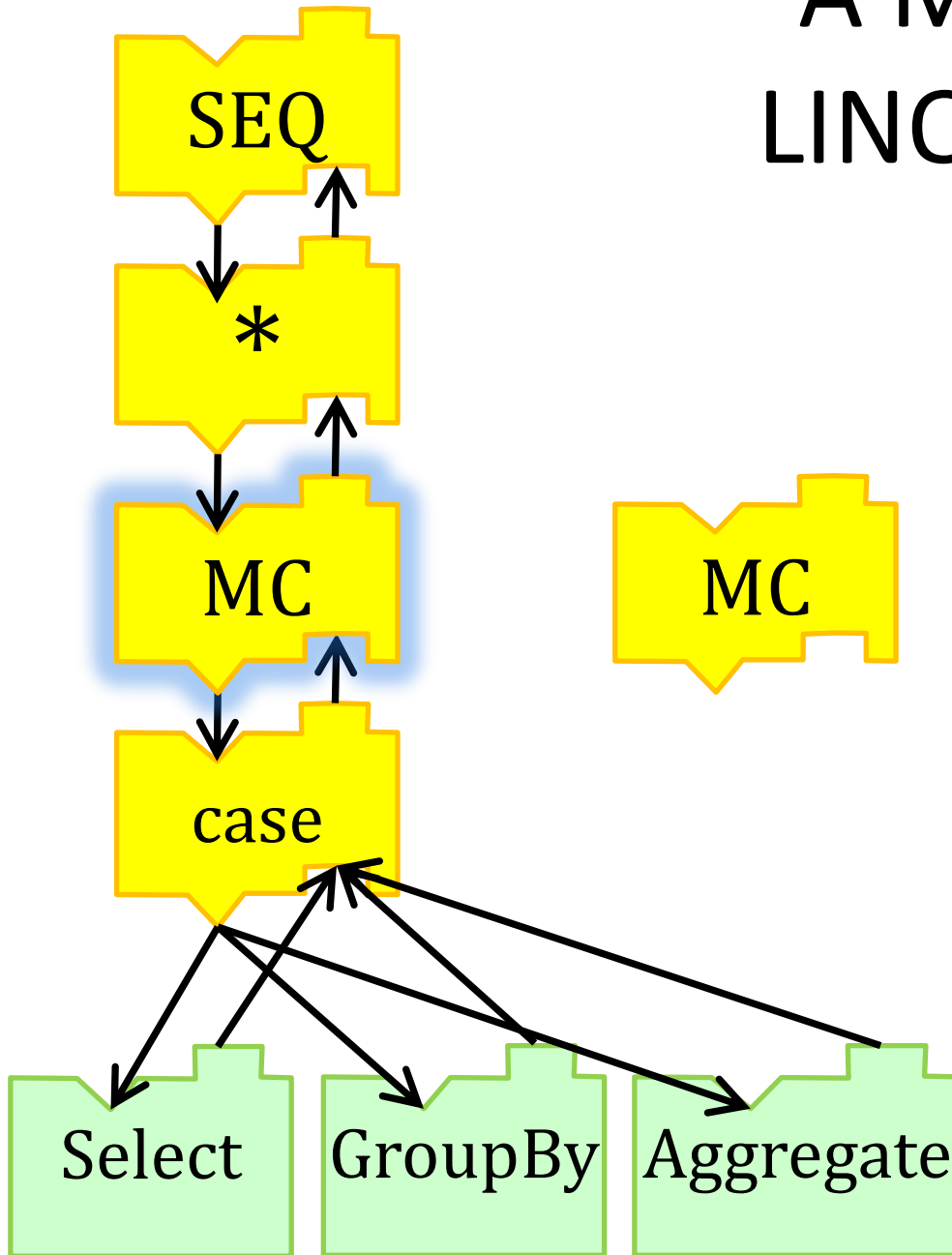
A LINQ Compiler



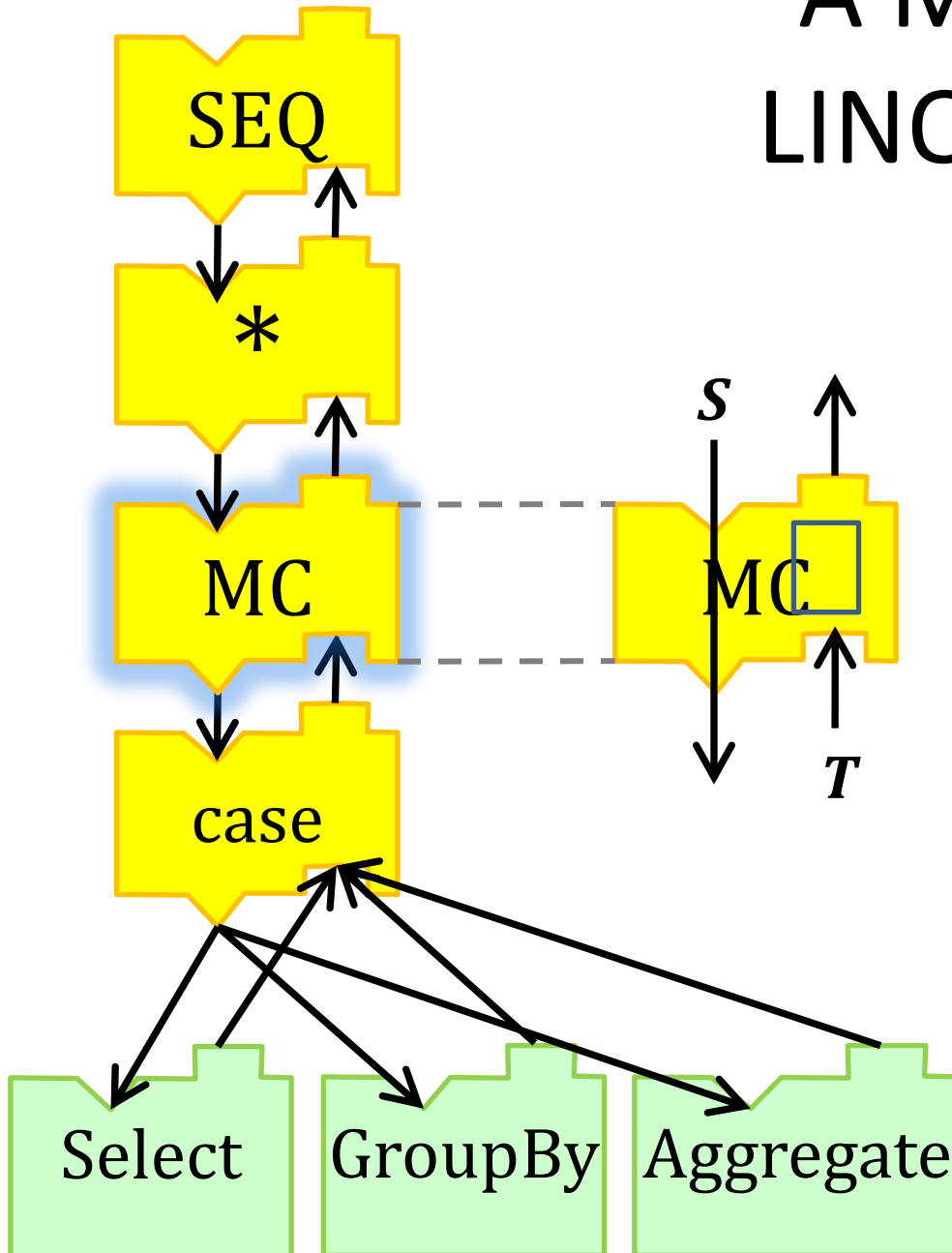
A Multi-Core LINQ Compiler



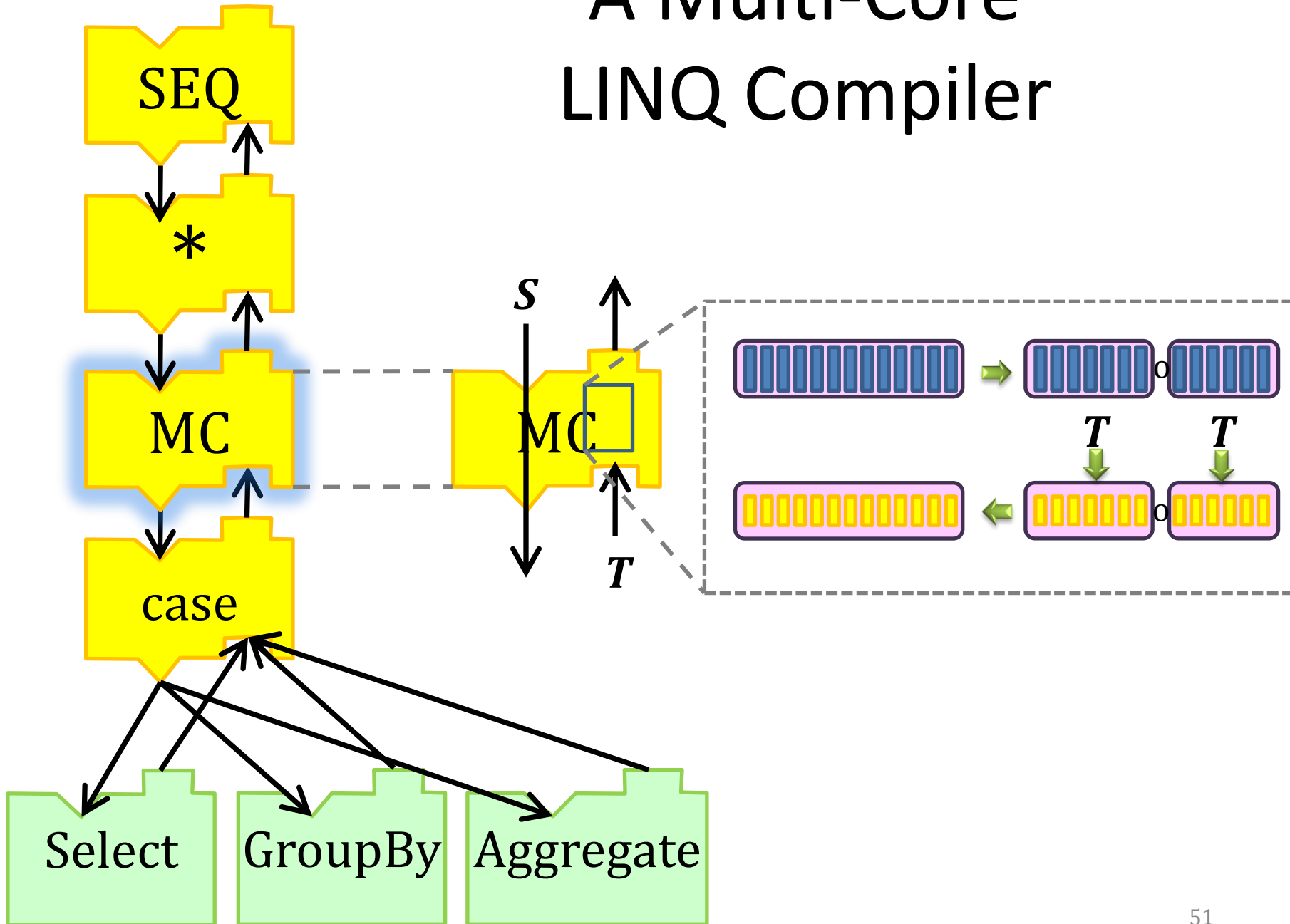
A Multi-Core LINQ Compiler



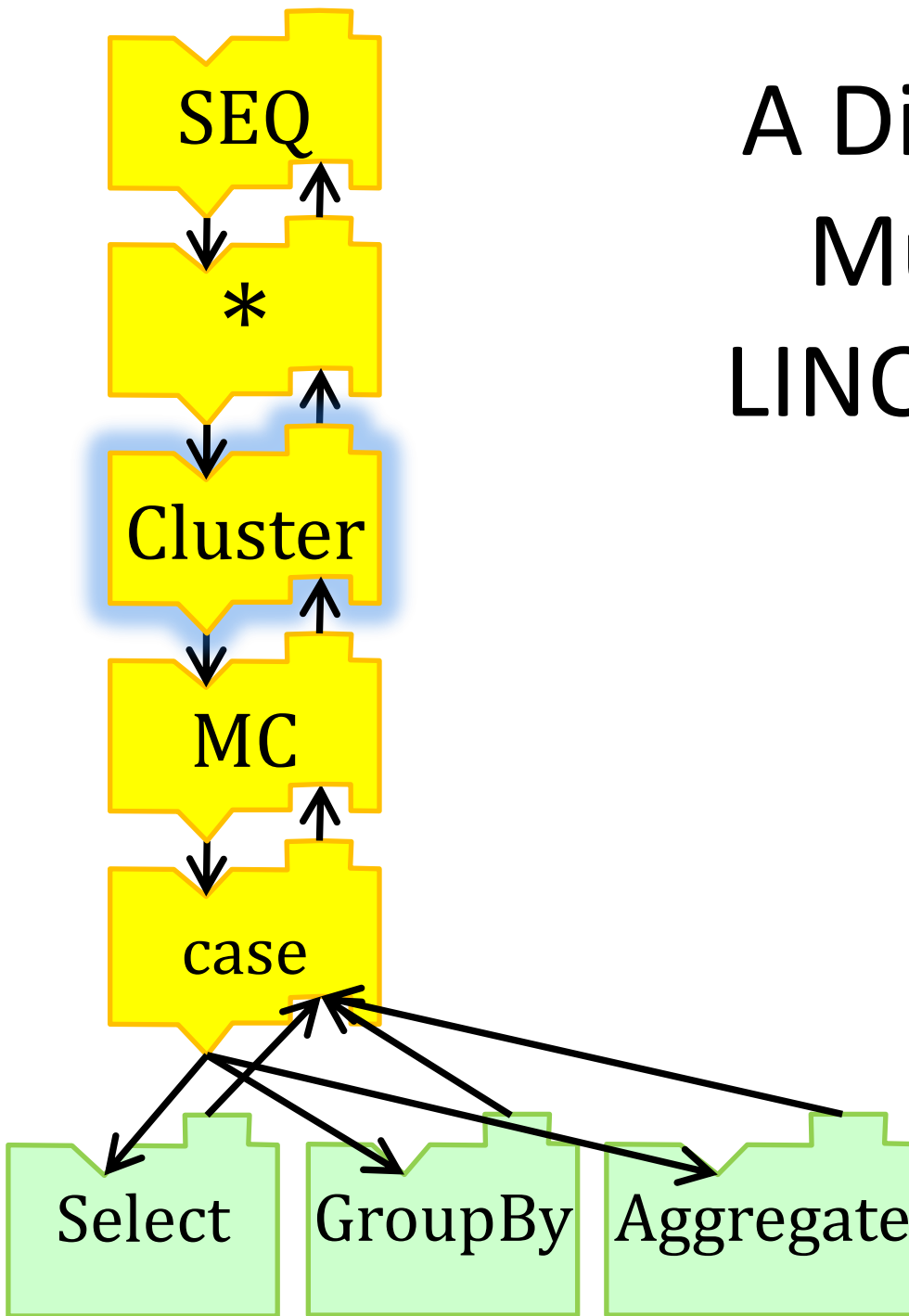
A Multi-Core LINQ Compiler



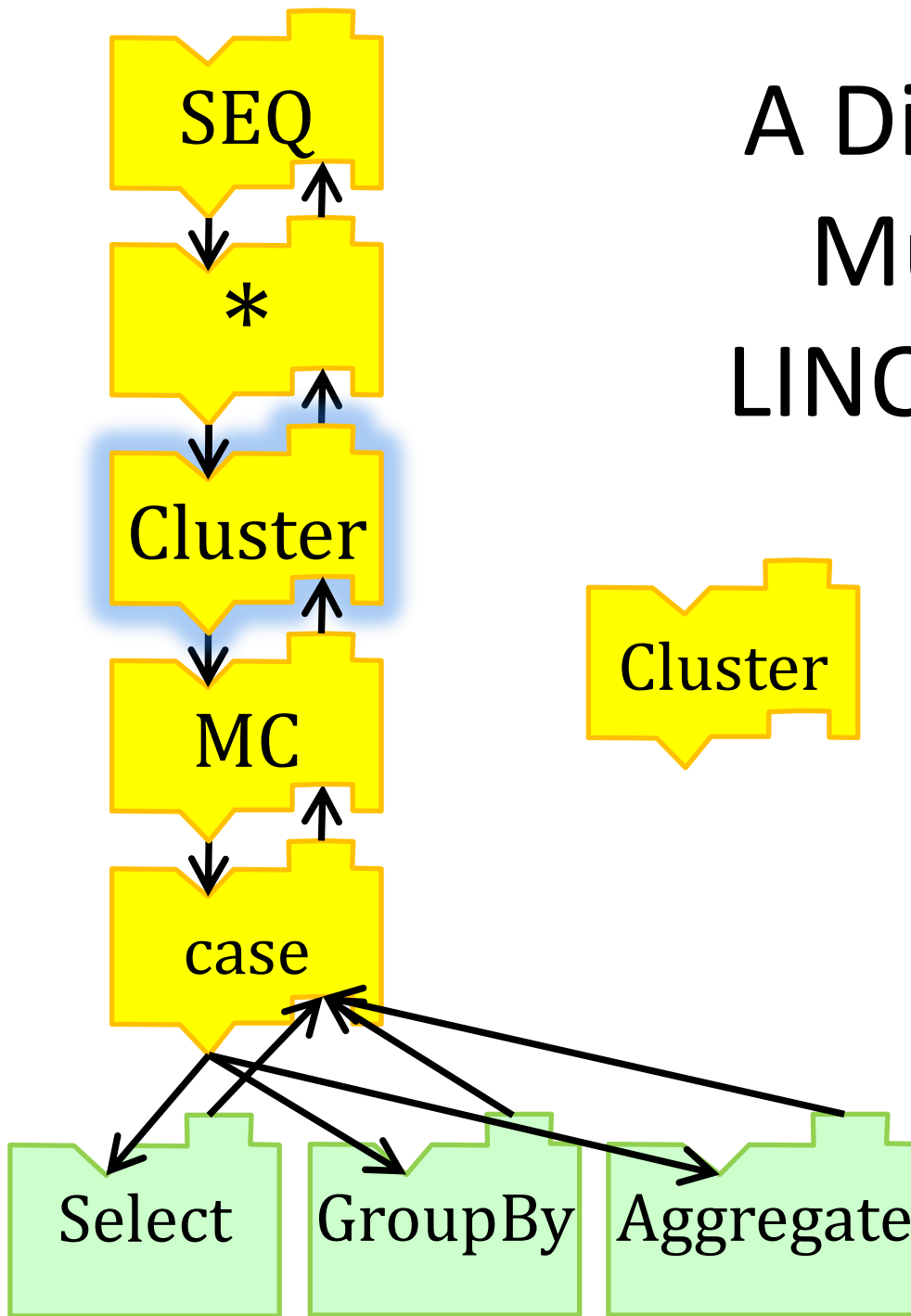
A Multi-Core LINQ Compiler



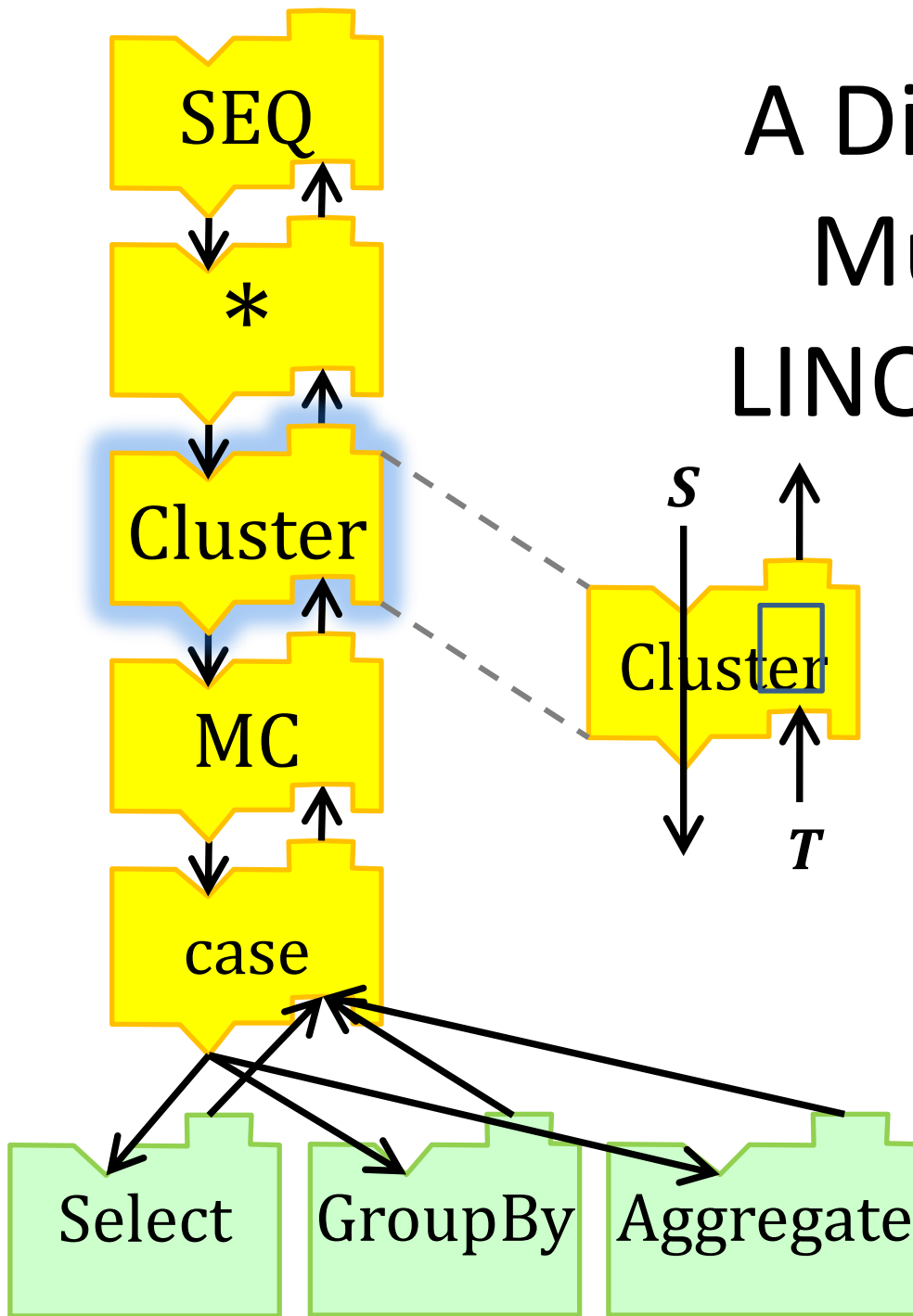
A Distributed, Multi-Core LINQ Compiler



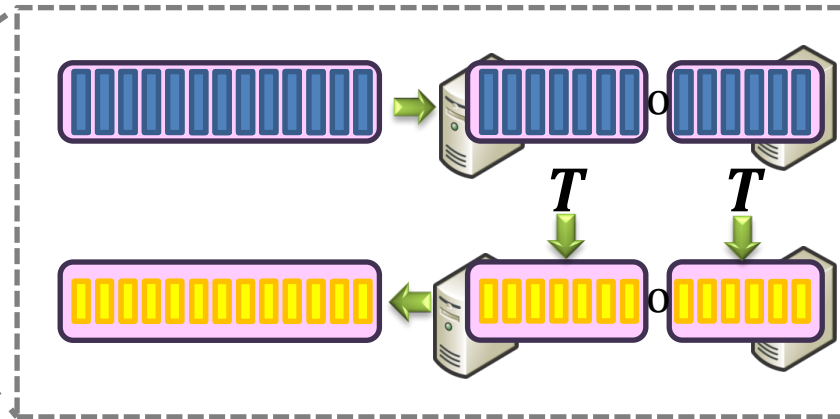
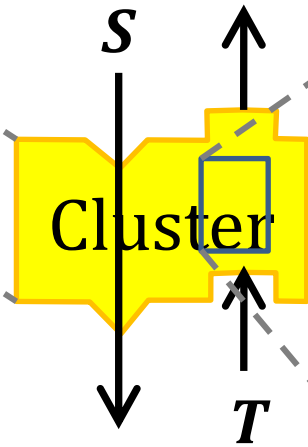
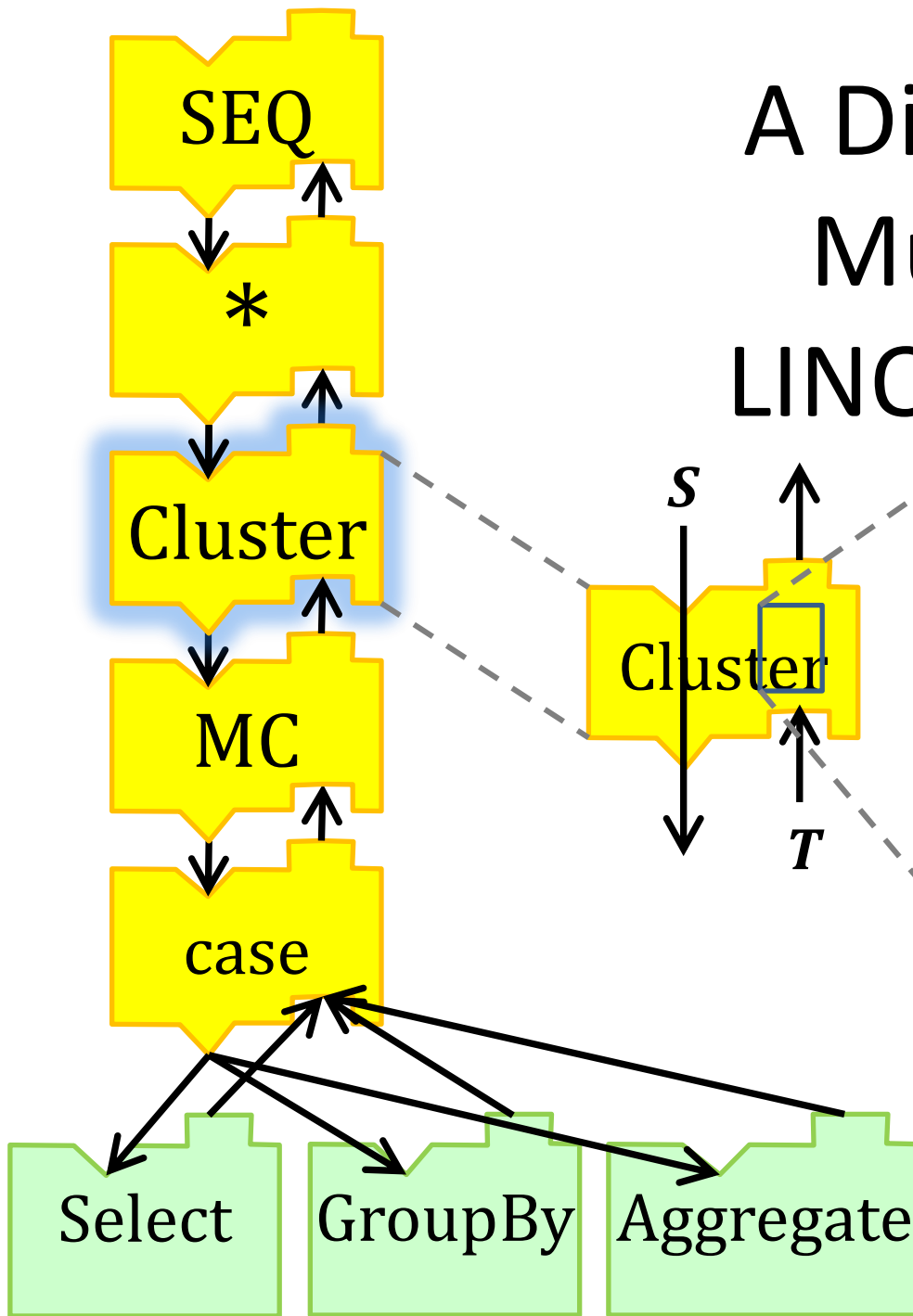
A Distributed, Multi-Core LINQ Compiler



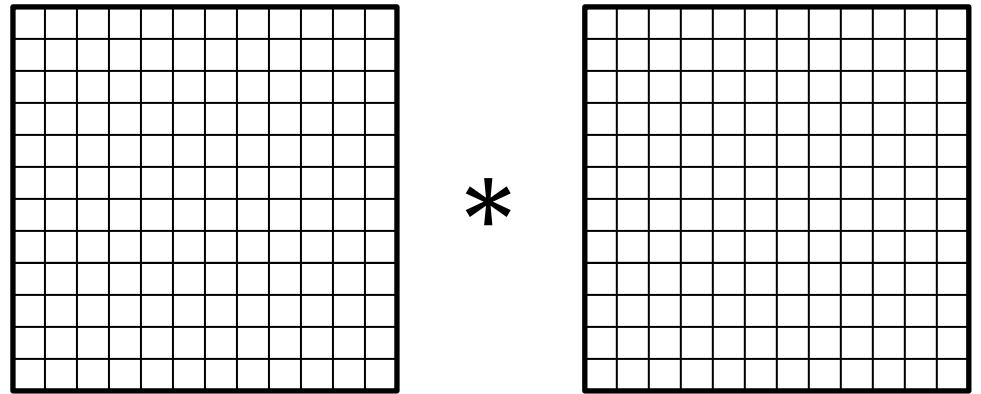
A Distributed, Multi-Core LINQ Compiler



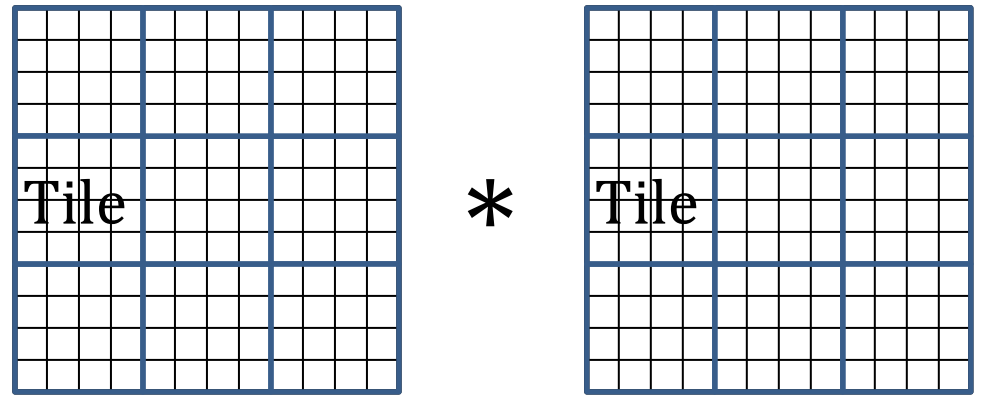
A Distributed, Multi-Core LINQ Compiler



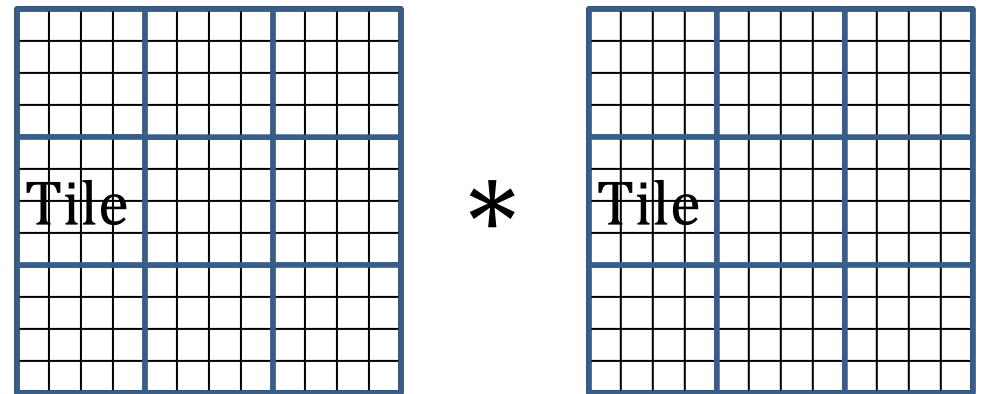
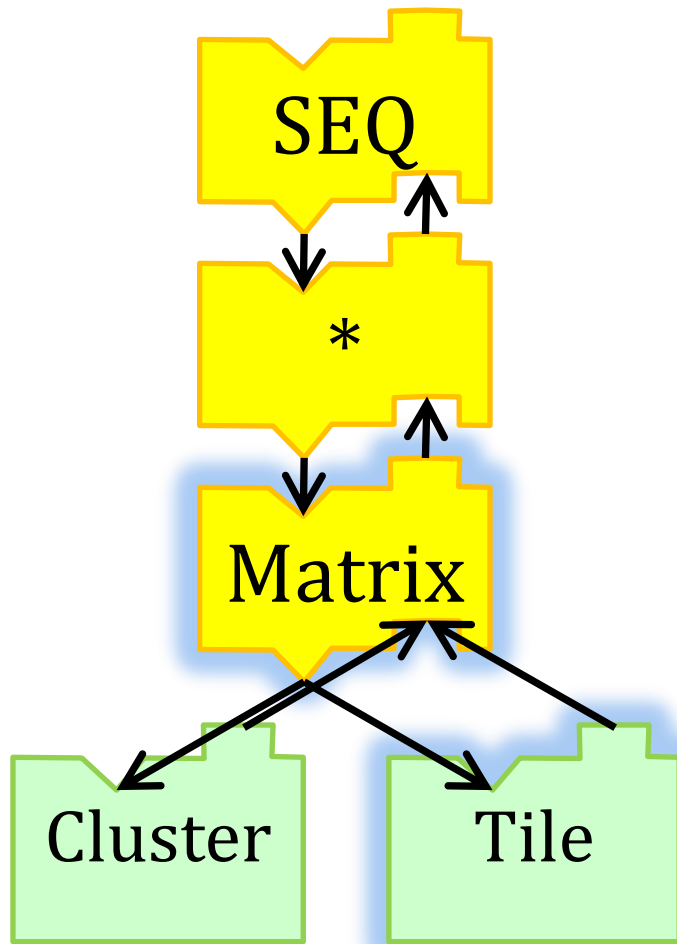
A Distributed Matrix Compiler



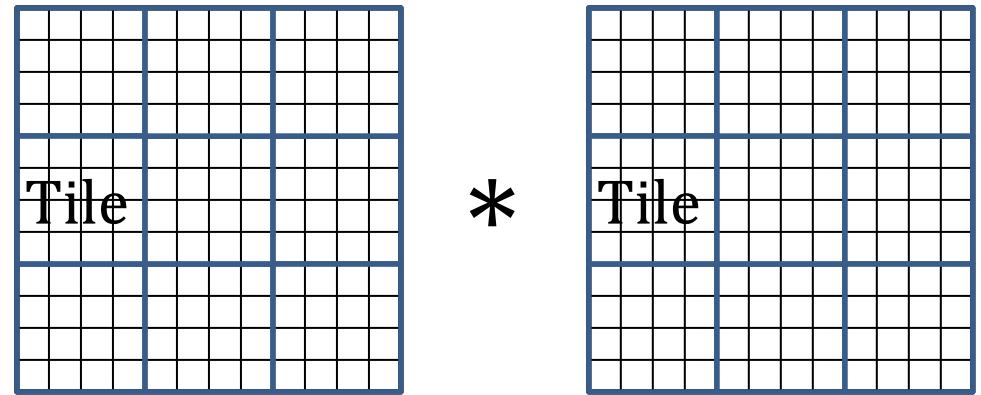
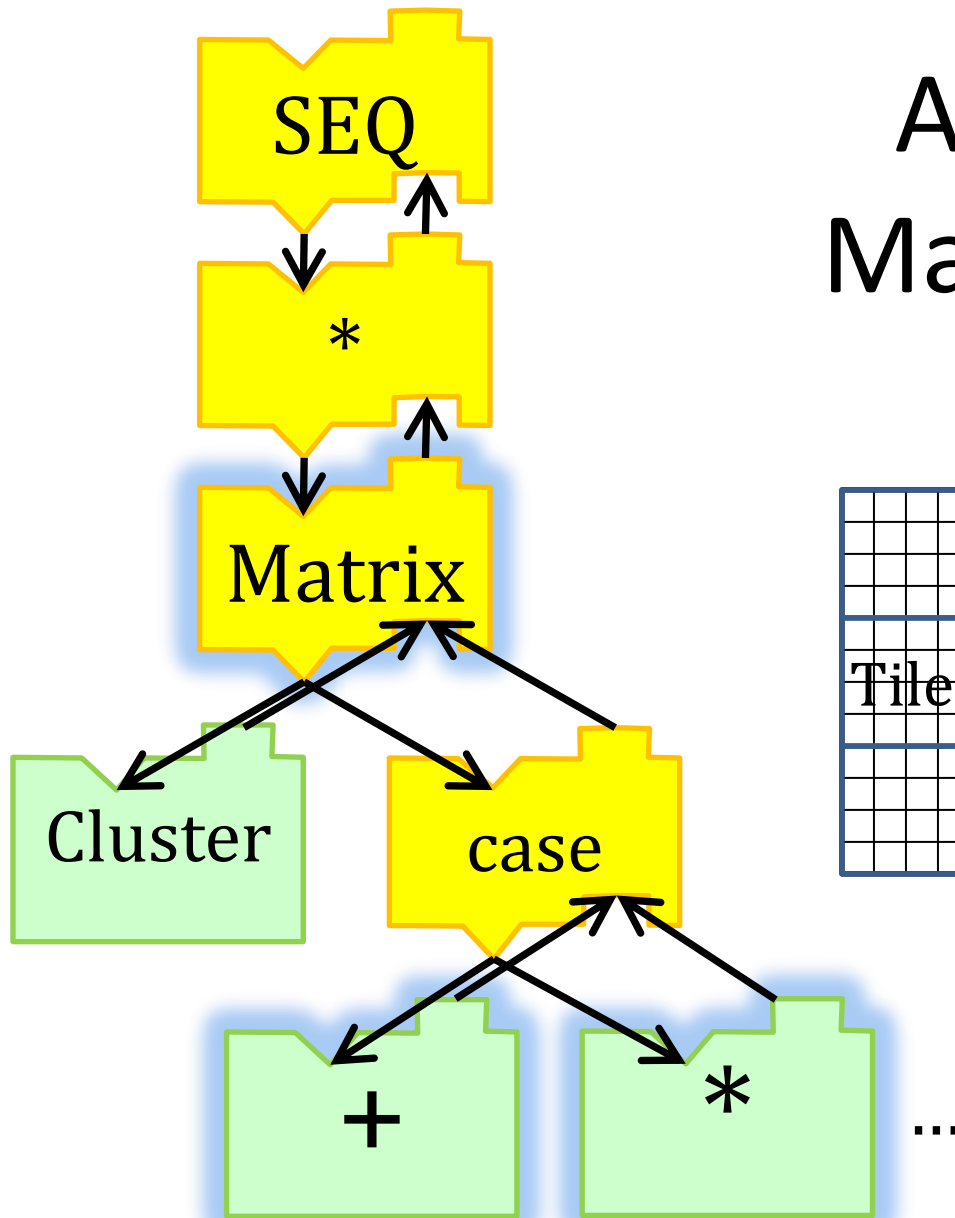
A Distributed Matrix Compiler



A Distributed Matrix Compiler



A Distributed Matrix Compiler

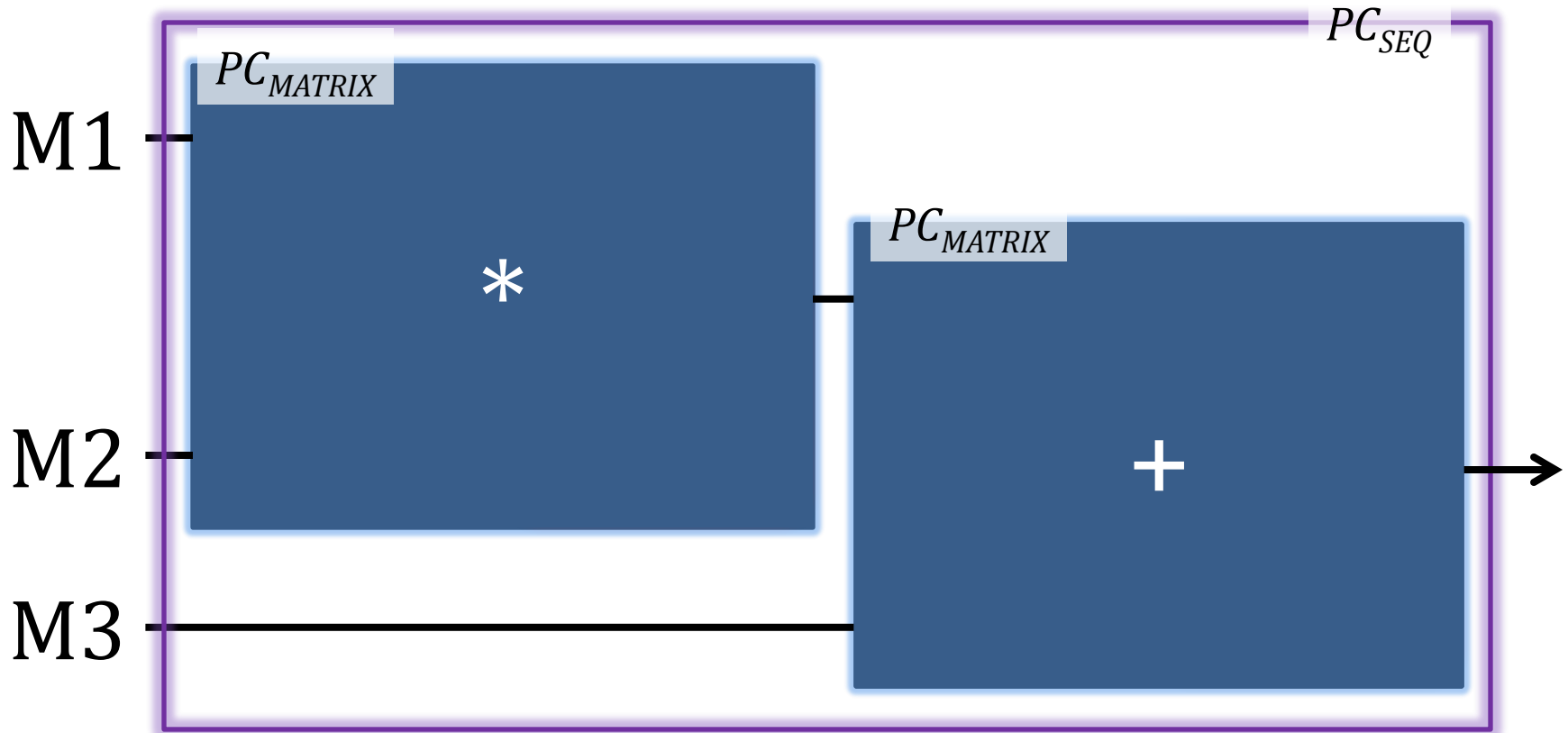


M1.Times(M2).Plus(M3)



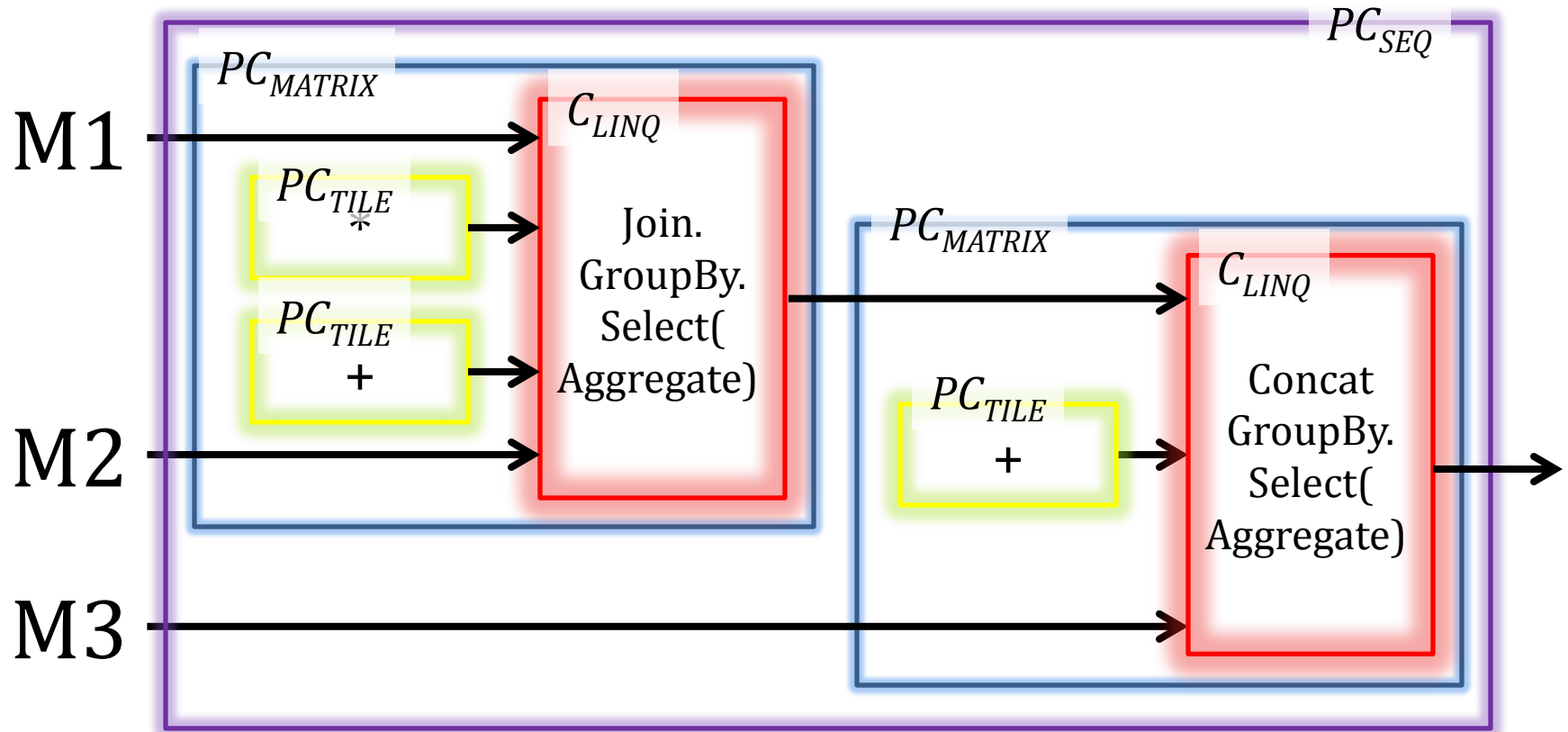
$$PC_{SEQ} \langle \langle PC_{Matrix} \langle \langle C_{Tile}, C_{LINQ} \rangle \rangle^* \rangle \rangle$$

M1.Times(M2).Plus(M3)



$PC_{SEQ} \langle \langle PC_{Matrix} \langle \langle C_{Tile}, C_{LINQ} \rangle \rangle^* \rangle \rangle$

M1.Times(M2).Plus(M3)



$$PC_{SEQ} \langle \langle PC_{Matrix} \langle \langle C_{Tile}, C_{LINQ} \rangle \rangle^* \rangle \rangle$$

M1.Times(M2).Plus(M3)

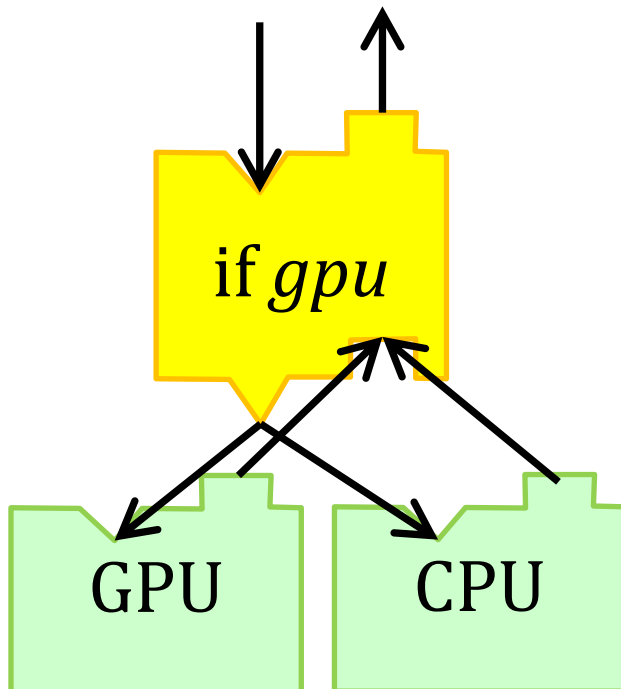
```
m1t = M1.Tiles.HashPartition(t => t.X)
m2t = M2.Tiles.HashPartition(t => t.Y)
m1m2 = m1t.Apply(m2t,
    (tt1, tt2) => tt1.Join(tt2, t => t.X, t => t.Y, (t1, t2) => new Tile(t1 * t2, t1.X, t2.Y))
    .GroupBy(t => t.Pos)
    .Select(g => g.Aggregate((t1, t2) => new Tile(t1 + t2, t1.Pos)))
    .HashPartition(t => t.Pos)
    .Apply(
        s => s.GroupBy(t => t.Pos)
        .Select(g => g.Aggregate((t1, t2) => new Tile(t1 + t2, t.Pos))))
```

```
m3t = M3.Tiles.Concat(m1m2)
    .HashPartition(t => t.Pos)
    .Apply(
        s => s.GroupBy(t => t.Pos)
        .Select(g => g.Aggregate((t1, t2) => new Tile(t1 + t2, t.Pos))))
```

PC_{SEQ} PC_{Matrix} C_{Tile} C_{CLUSTER} C_{LINQ}

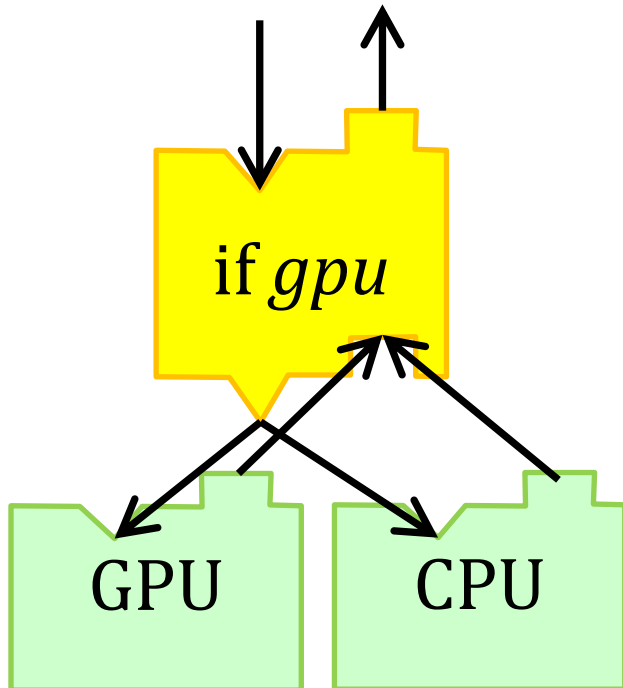
Partial Compiler Correctness

$$\frac{\{ \text{pred}(S) = 1 \wedge \varphi(S) \} C_1 \quad \{ \text{pred}(S) = 0 \wedge \varphi(S) \} C_2}{\{ \varphi(S) \} \text{IF pred THEN } C_1 \text{ ELSE } C_2}$$



Partial Compiler Correctness

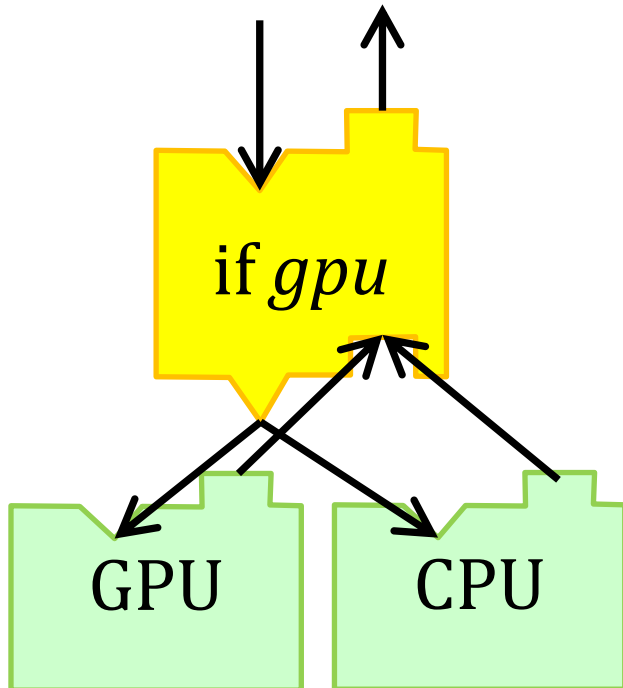
$$\frac{\{pred(S) = 1 \wedge \varphi(S)\}C_1 \quad \{pred(S) = 0 \wedge \varphi(S)\}C_2}{\{\varphi(S)\}IF \text{ pred } THEN C_1 ELSE C_2}$$



$$\frac{\{gpu(S)\}C_{GPU} \quad \{\neg gpu(S)\}C_{CPU}}{\{T\}IF \text{ gpu } THEN C_{GPU} \text{ else } C_{CPU}}$$

Partial Compiler Correctness

$$\frac{\{pred(S) = 1 \wedge \varphi(S)\}C_1 \quad \{pred(S) = 0 \wedge \varphi(S)\}C_2}{\{\varphi(S)\}IF \text{ pred } THEN C_1 ELSE C_2}$$



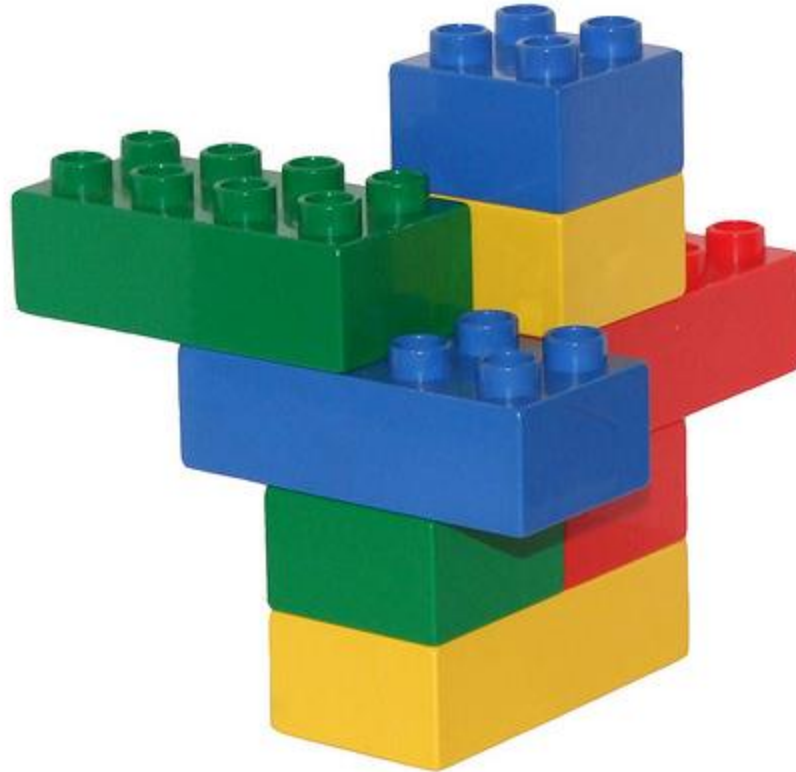
$$\frac{\{gpu(S)\}C_{GPU} \quad \{\neg gpu(S)\}C_{CPU}}{\{T\}IF \text{ gpu } THEN C_{GPU} \text{ else } C_{CPU}}$$

↑
Totally correct compiler from
partially correct parts!

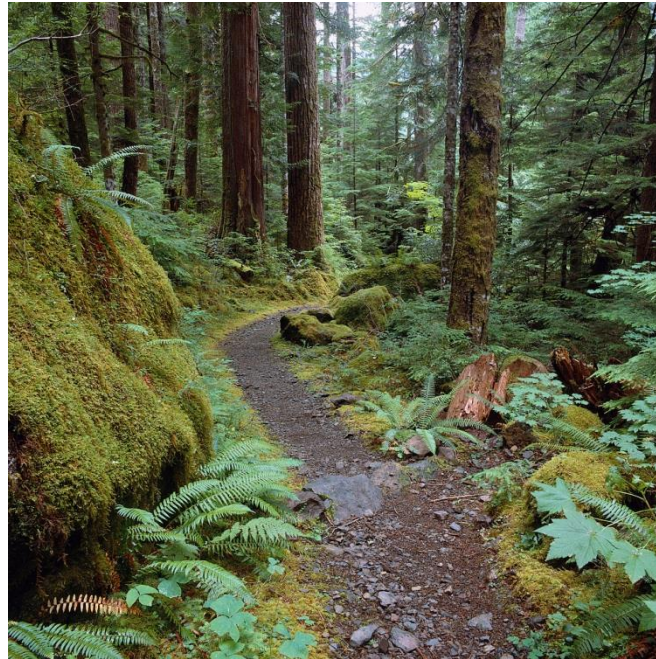
Related Work

- Dialectica category
 - Inspired partial compilers and their operators.
- Milner's tactics
 - Partial compilers are a typed form of tactics.
- Multistage compilers
 - Fit as a composition of unary partial compilers.
- Federated databases, cooperating analyses
 - Interesting applications.

Thank you



Backup slides



Homomorphisms

collections



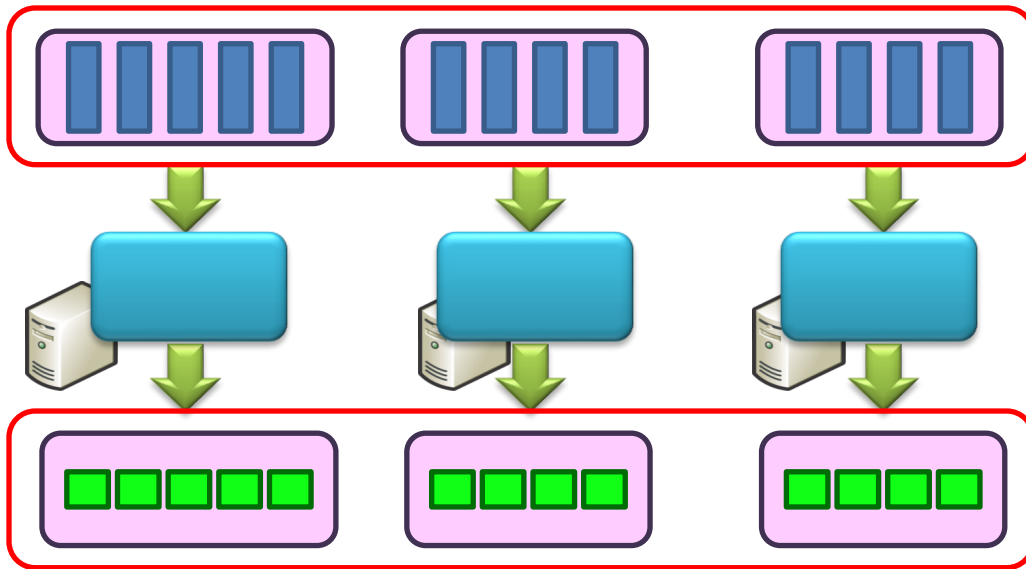
$$h : A \rightarrow B$$

$$h(a_1 \uparrow_A a_2) = h(a_1) \uparrow_B h(a_2)$$



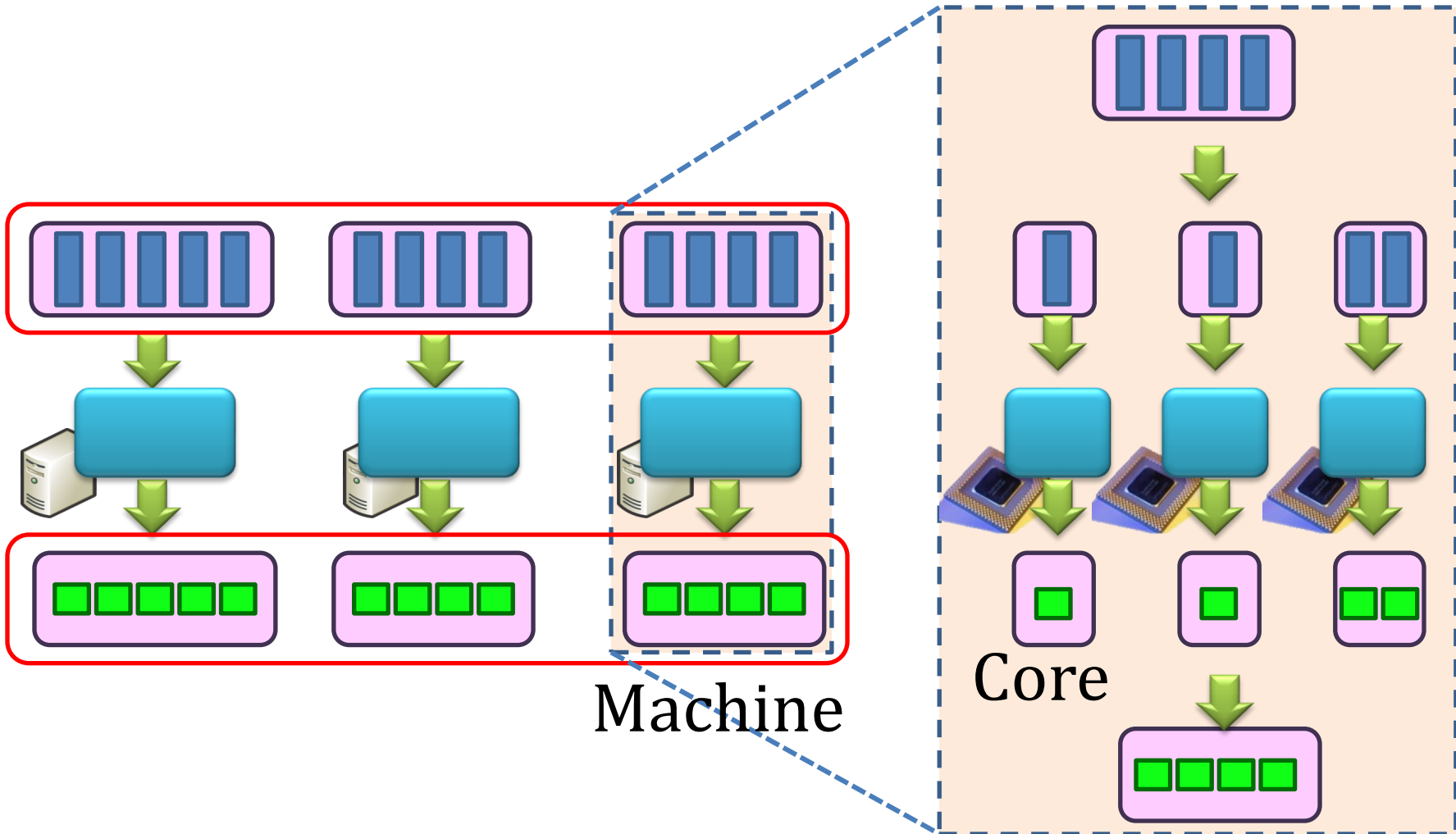
concatenation

Nested Parallelism



Machine

Nested Parallelism

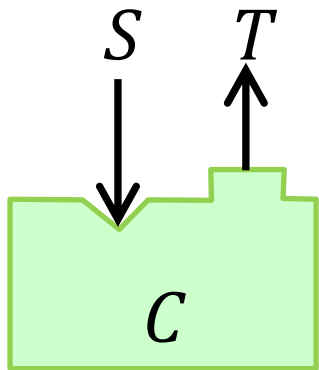


Correctness Definition

$\models \subseteq target \times source$

$T \models S$

T implements the meaning of S

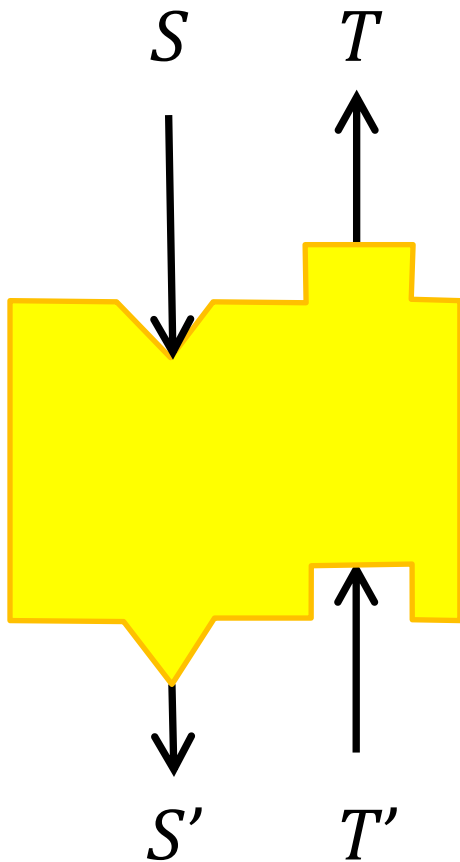


$C : source \rightarrow target$

C is correct w. resp. to \models iff

$\forall S \in source. C(S) \models S$

Partial Compiler Correctness



$\models \subseteq \text{source} \times \text{target}$

$\models' \subseteq \text{source}' \times \text{target}'$

PC is correct iff

$\forall S, T'. T' \models' S' \Rightarrow T \models S$

Correctness Theorems

PC, C correct $\Rightarrow PC \llbracket C \rrbracket$ correct

$PC \otimes PC'$ correct

C^* correct

etc.



Partial Correctness

$$\{\varphi(S)\} \models C \quad \equiv \quad \forall S. \varphi(S) \Rightarrow C(S) \models S$$

Correct only for
some programs

$$\{\varphi(S)\} PC \{\varphi'(S')\}$$

Correct only for
some programs

Generated sub-programs
satisfy this predicate

Partial Correctness

$$\{\varphi(S)\} \models C \quad \equiv \quad \forall S. \varphi(S) \Rightarrow C(S) \models S$$

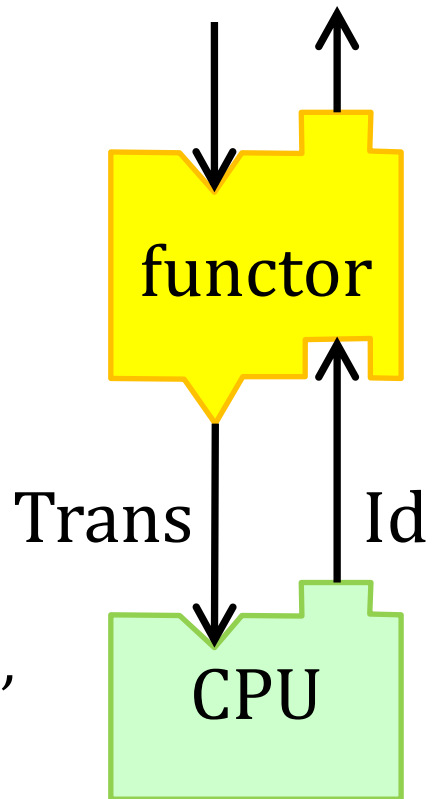
Correct only for
some programs

{Precondition} PC {Postcondition}

Correct only for
some programs

Generated sub-programs
satisfy this predicate

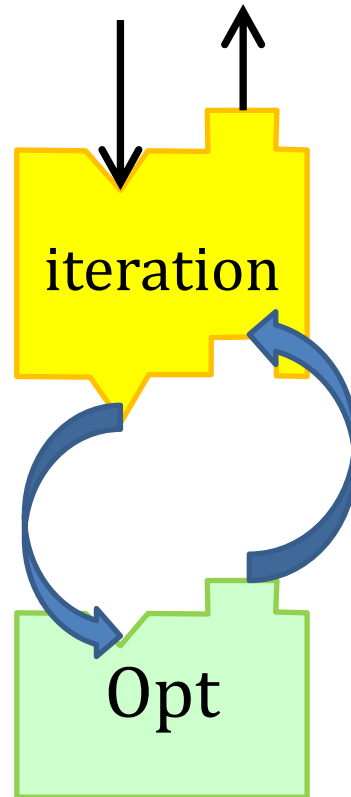
Functor



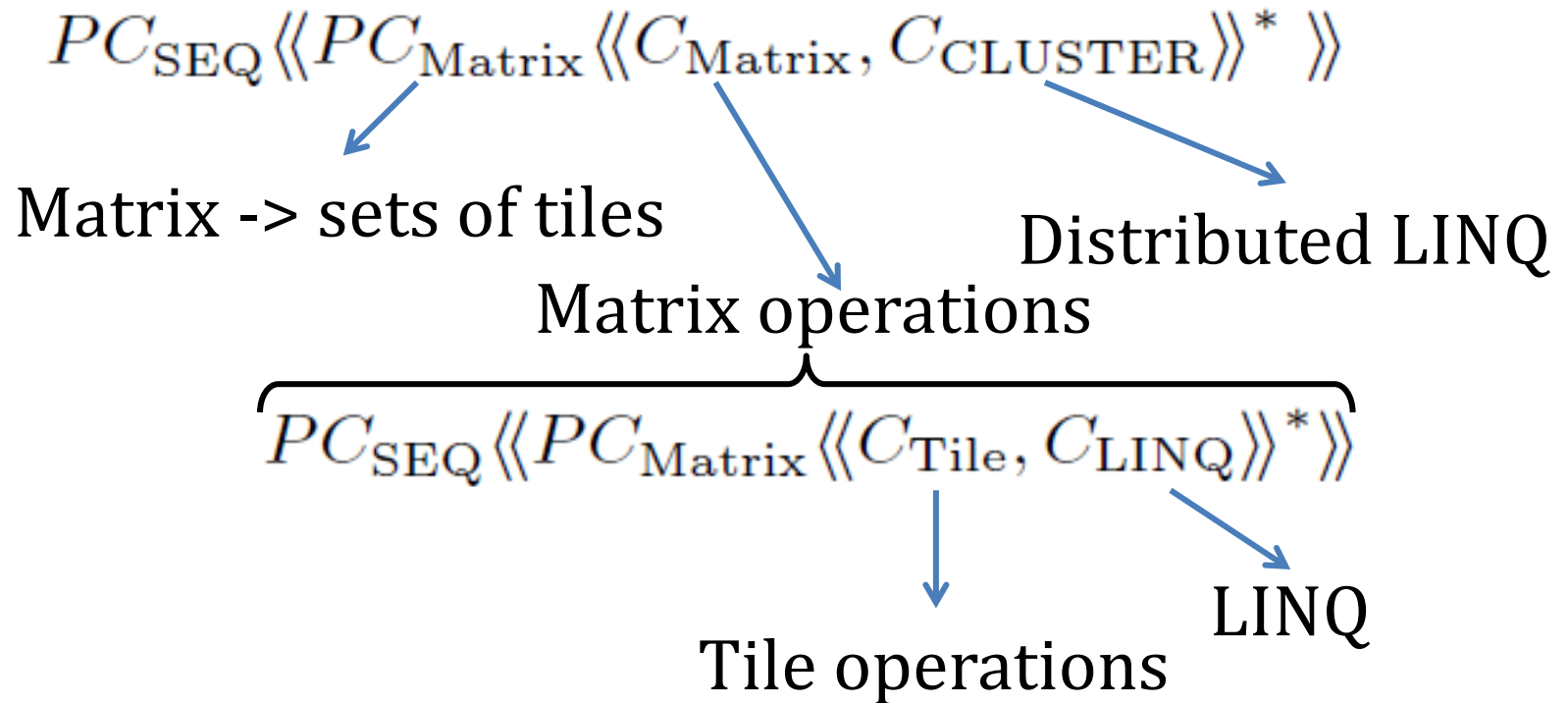
Trans : source -> source'

Id : target -> target'

Iteration



A Distributed Matrix Compiler



Staged Compilers

$$\text{source}_1 \xrightarrow{\text{Trans}_1} \dots \xrightarrow{\text{Trans}_{n-1}} \text{source}_n \xrightarrow{C} \text{target}$$

$$PC_{\text{Stage}} =_{\text{def}} PC_{\text{Func}}(\text{Trans}_1, \text{Id}) \langle\langle \dots \langle\langle PC_{\text{Func}}(\text{Trans}_{n-1}, \text{Id}) \rangle\rangle \dots \rangle\rangle$$

$$PC_{\text{Stage}} \langle\langle C \rangle\rangle$$