

# DATA PARALLEL

$$f(x_i) \parallel f(x_j)$$

**MAP**

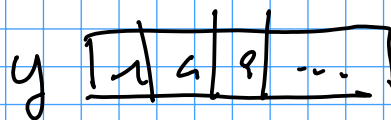
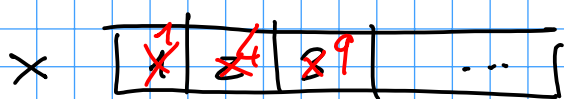
$$\langle x_1 \dots x_n \rangle \xrightarrow{f} \langle f(x_1) \dots f(x_n) \rangle$$

- ⊗ embarrassingly parallel
- ⊗ result isomorphic to the input

$$x_i : \alpha \quad f: \alpha \rightarrow \beta \quad y_i : \beta$$

"in place"

not "in place"



$$x \rightarrow x^2$$

associative  
commutative

**REDUCE**

$$\langle x_1 \dots x_n \rangle$$

$$\oplus$$

$$x_1 \oplus x_2 \oplus \dots \oplus x_n$$

$$x_i : \alpha$$

$$\oplus : \alpha \times \alpha \rightarrow \alpha$$

$$y : \alpha$$

$$\text{foldr} : \alpha \text{ list} \times \alpha \rightarrow \alpha \quad [x_1 :: [x_2 :: (\dots)]]$$

foldl

$$x_1 \oplus (x_2 \oplus \dots)$$

Inner Product

$$\langle x_1 \dots x_n \rangle \times \langle y_1 \dots y_n \rangle$$

$$\sum_{i=1}^n x_i * y_i$$

↓  
(reduce  $\oplus$ ) (map  $*$ )

$$\text{map zip } \langle x_1 \dots x_n \rangle \langle y_1 \dots y_n \rangle * =$$

$$\langle x_1 * y_1, x_2 * y_2, \dots, x_n * y_n \rangle$$

Google Map Reduce  $f$   $g$   $\langle x_1 \dots x_2 \rangle$

$$f : x_i \rightarrow \text{pair}(v_i, k_i)$$

$$g : \langle \text{pair}(v_1, k_x) \dots \text{pair}(v_m, k_x) \rangle \\ \rightarrow \underline{v_1(g) v_2(g) v_3 \dots (g) v_m}$$

$$\underline{\text{count words}} \equiv \text{Google Map Reduce} \left( \text{word} \rightarrow (1, \text{word}), \right. \\ \left. \underline{(x, w) \times (y, w) \rightarrow (x+y, w)} \right)$$

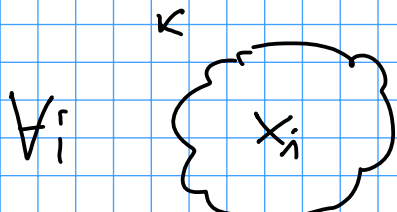
for ( $w : \text{words}$ )

if ( $w \in \text{HashMap}$ )  $\text{hashmap}(w)++$   
else  $\text{insert}(w, 1) \rightarrow \text{hashmap}$

# Stencil pattern

$$op: \underbrace{\alpha \times \alpha \times \dots \times \alpha}_k \rightarrow \alpha$$

<  $x_i$  >

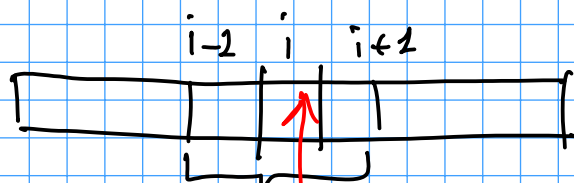


k items

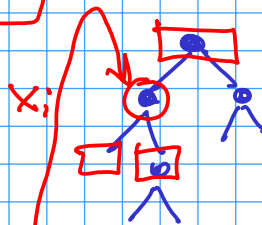
op



$y_i$



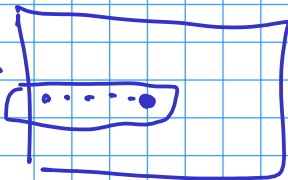
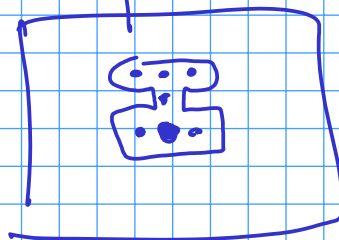
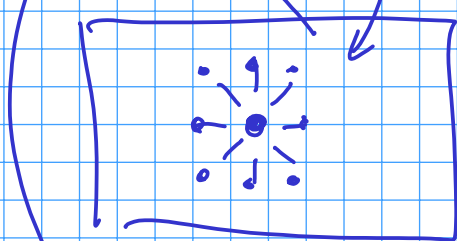
3-ary neighbourhood



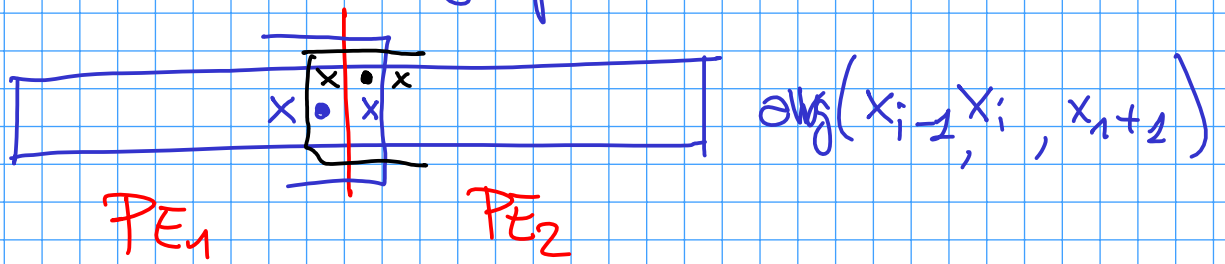
Neighbourhood

fixed	regular
variable	irregular

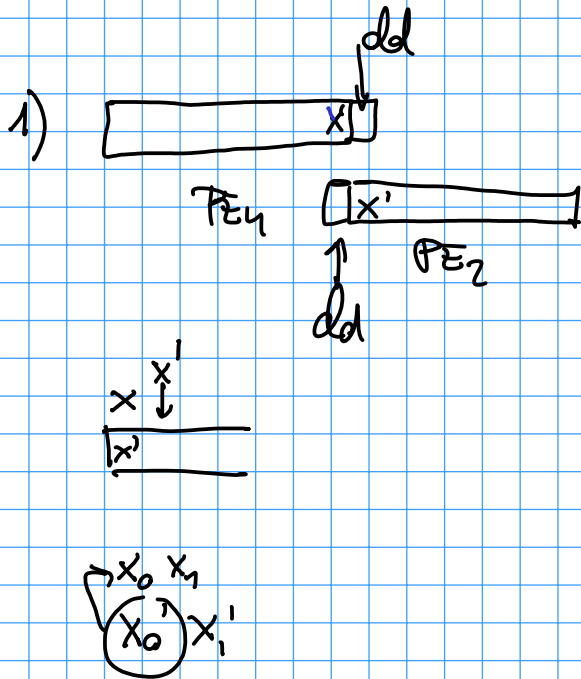
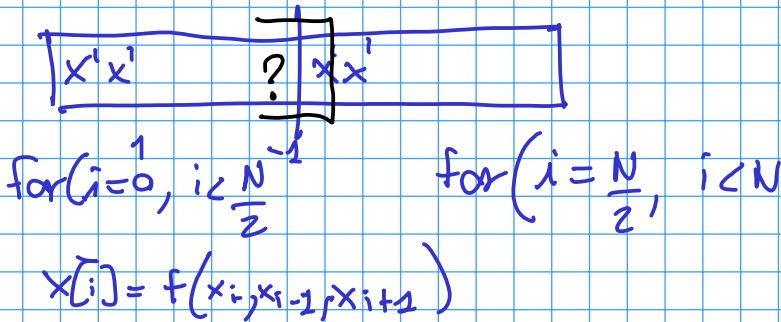
$f(\square\square\square\square)$



1) it is <sup>not</sup> ~~is~~ embarrassingly parallel

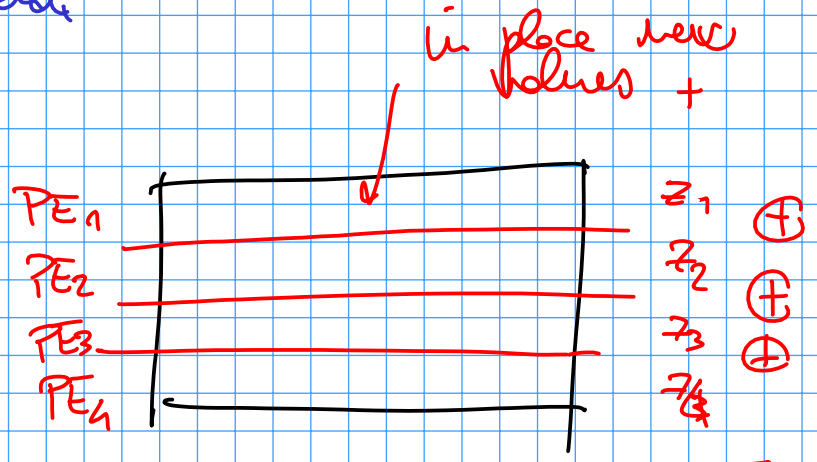
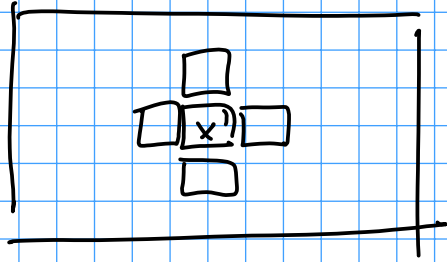


2) in place not in place makes difference (iterative stencils)



2) need a buffer  
 holds the new  
 values computed  
 up to the point  
 the corresponding positions  
 are no more  
 needed "as old values"  
 to compute "new"  
 values

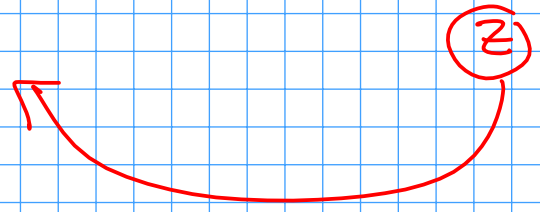
stencil - reduce pattern



$\oplus$   
 $i = \dots$

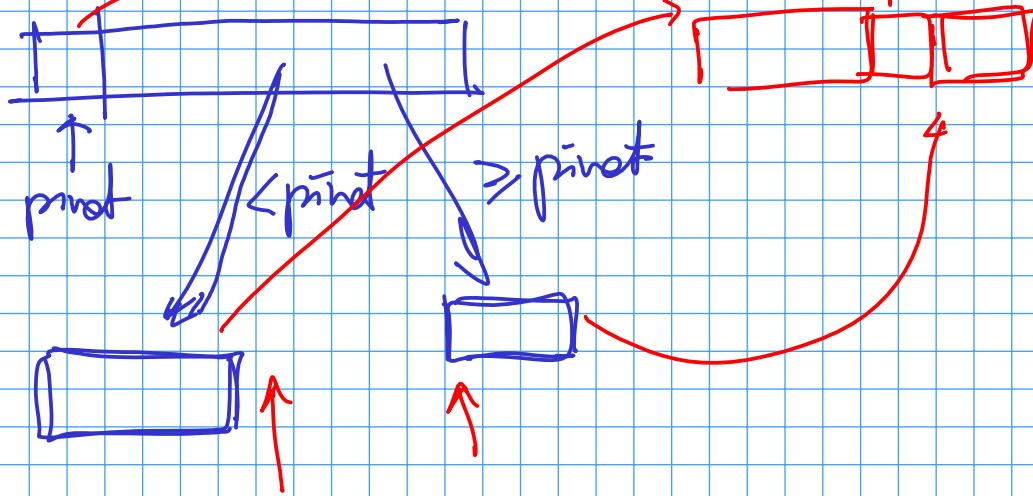
$$|x^i - x^{i+4}|$$

$$< \epsilon$$



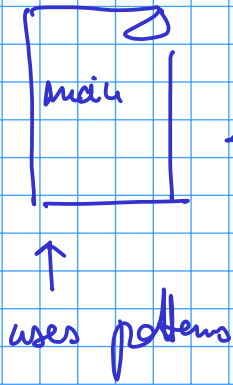
# divide & conquer

↓  
sorting of an array  
quick sort

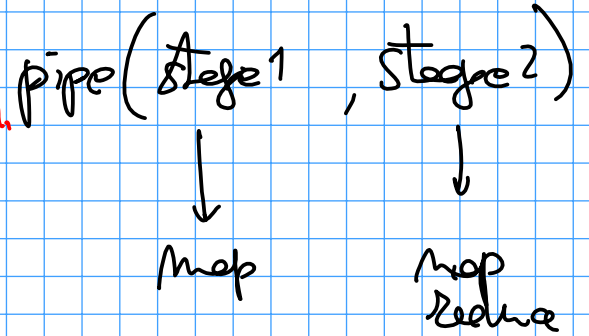
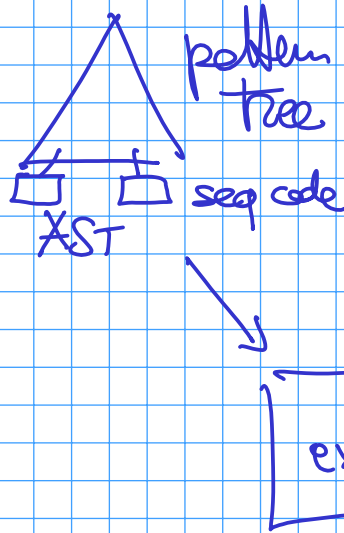


# Implementation of "pattern frameworks" with composition

"template based"



"micro data flow"

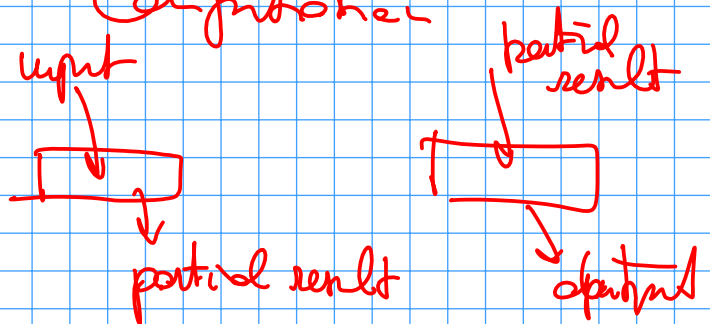


①

If patterns I know  
some "templates"  
implementations  
for the patterns in  
the AST  
→ use these templates

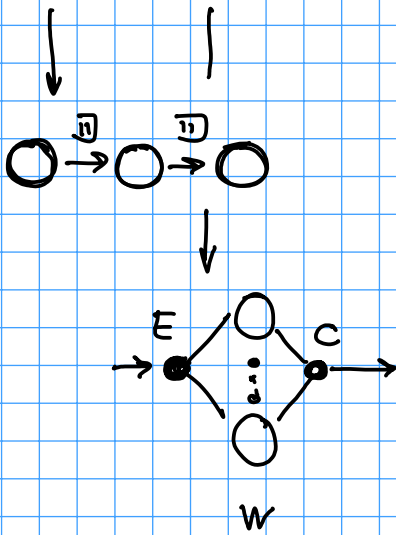
②

turn each pattern  
into code that  
computes "parallel"  
chunks of the overall  
computation

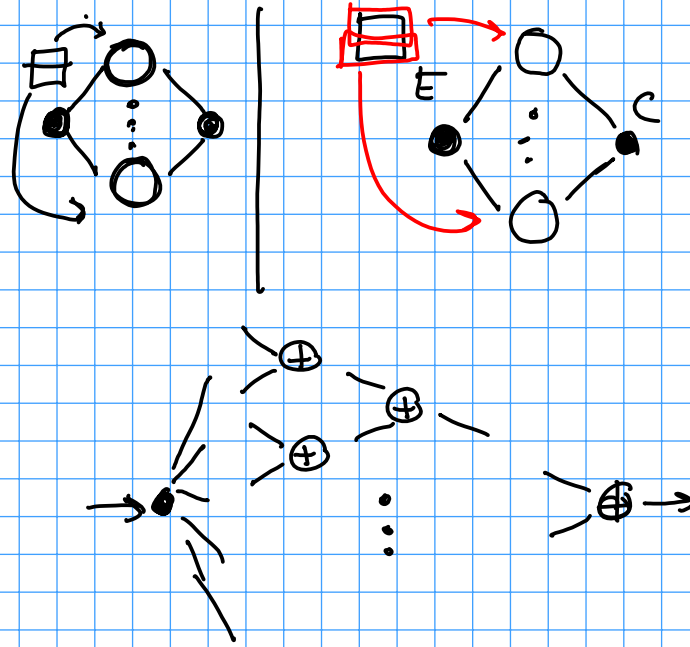


provide a generic  
interpreter executing  
these tasks (ASAP)

## PIPE FARM



## MAP REDUCE STENCIL



## Parameters

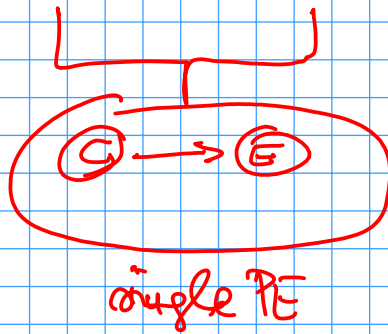
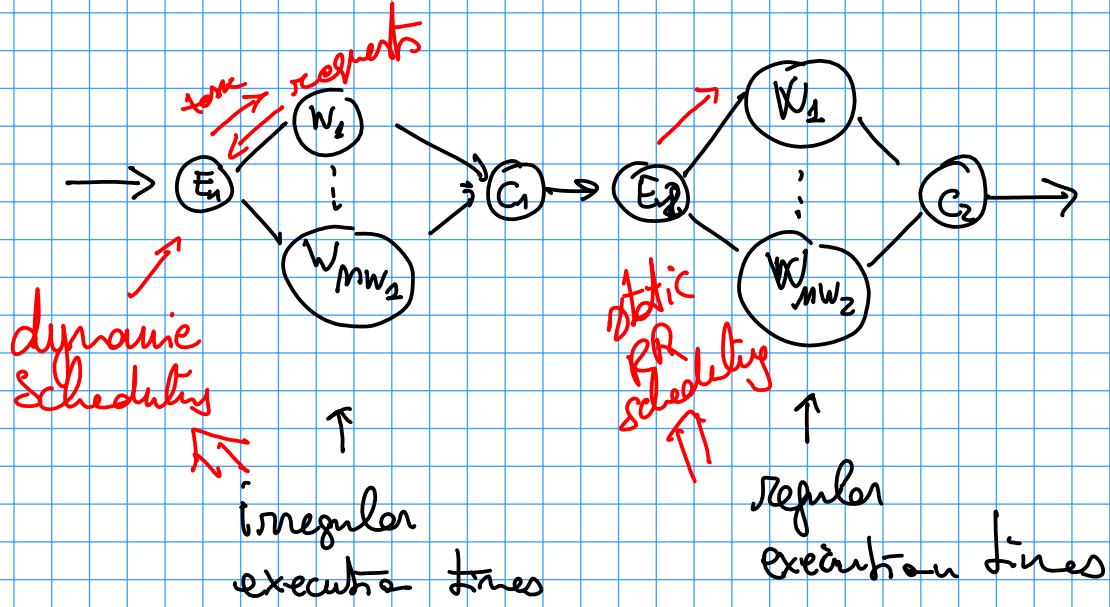
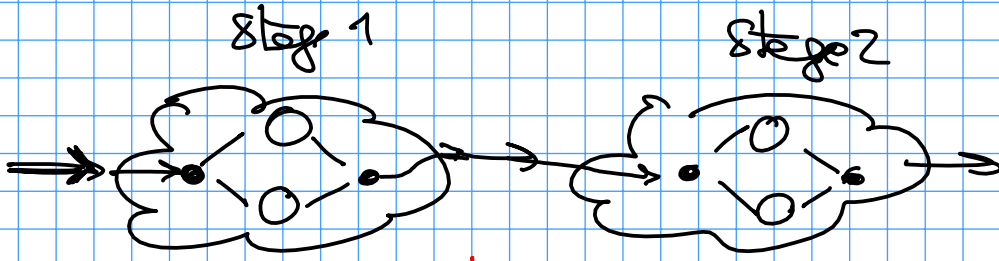
- per degree
- scheduling
- load balancing policies

1 entry point (here I get the input)  
1 exit point (here I put the result)

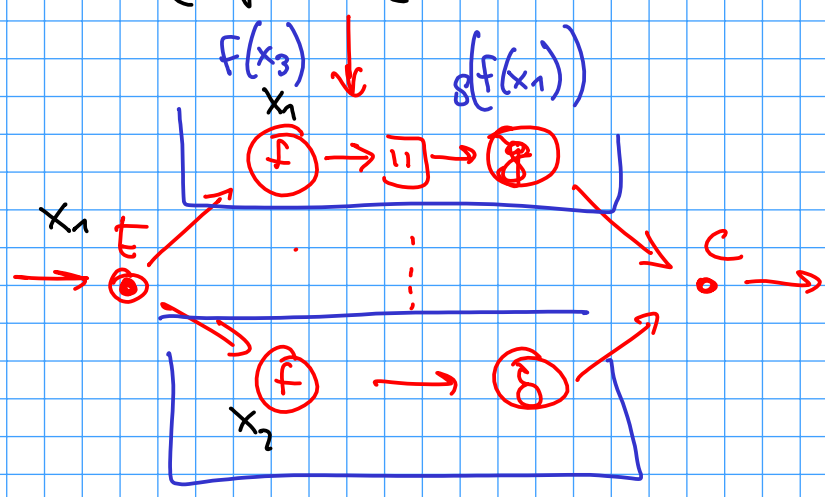
- business logic code  
e.g. function computed by workers  
by stages



# Compass (cluster 1 entry/exit point simple)

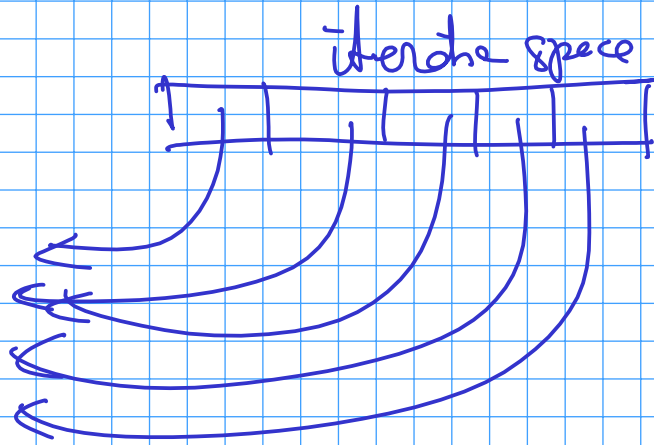
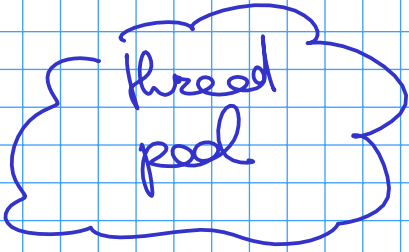


fun ( pipe ( f , g ) )



Open MP

#pragma omp parallel for ... chunksize(n)

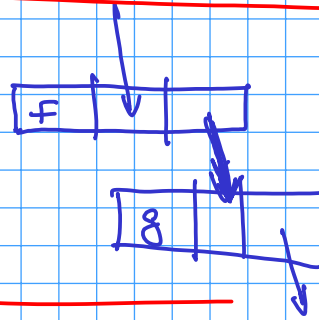


# MACRO DATA FLOW BASED

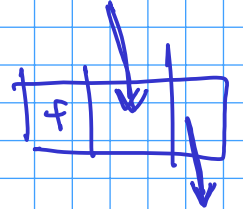
PATTERN

GRAPH OF // COMPUTATIONS

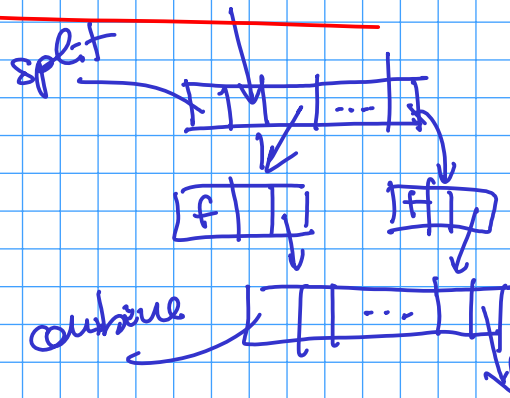
PIPE (f, s)



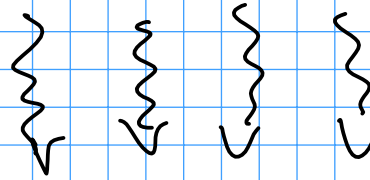
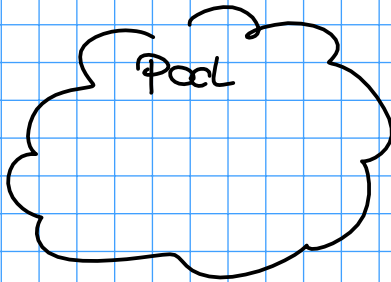
FARM (f)



MAP (f)

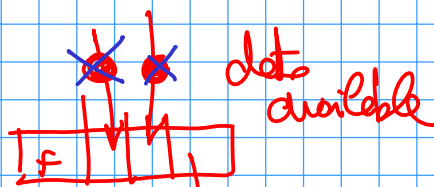


## PARALLEL INTERPRETER



- forever }
- get a fireable instr from pool
  - compute
  - put results in the pool

FIREABLE INSTR

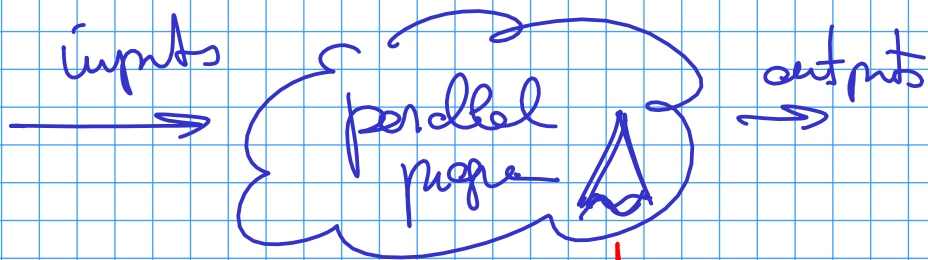


$f(x, y)$

COMPUTE



put back into pool : if it is the last one → FIREABLE INSTRUCTION

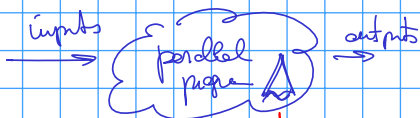


① compile the network tree into a graph

②  $\forall$  input items

→ create 1 instance of the graph with the input as input data & put it into the pool

③ activate the thread pool (interpreters)

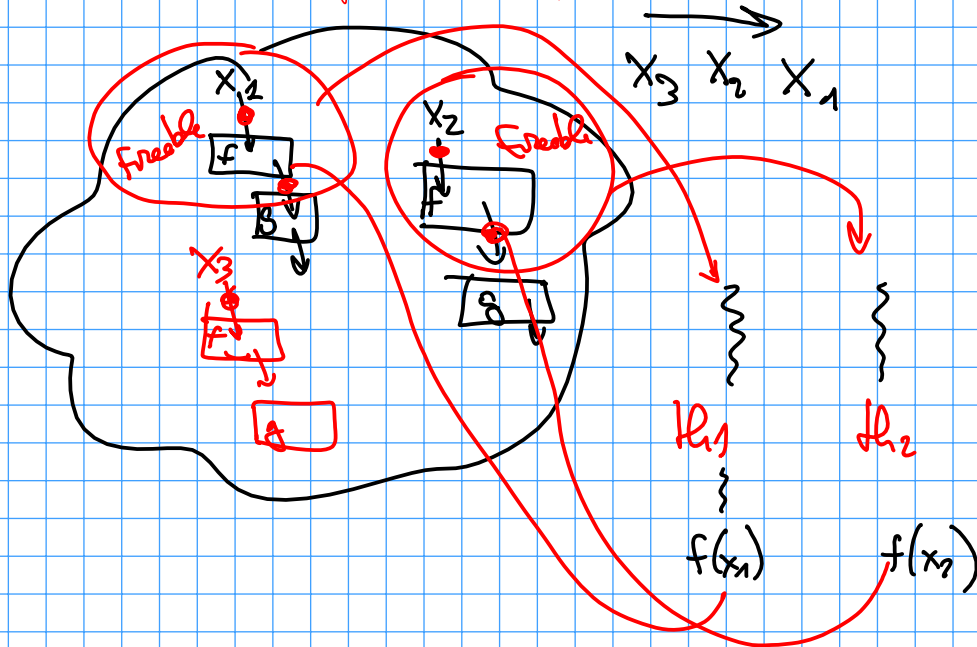
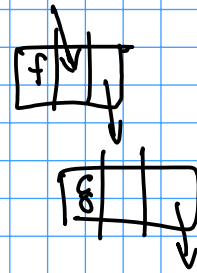


① compute the node tree into a graph

②  $\forall$  input items  
 → create 1 instance of the graph with the input as input token & put it into the pool

③ schedule the thread pool (interpreters)

pipe (form (f), 8)

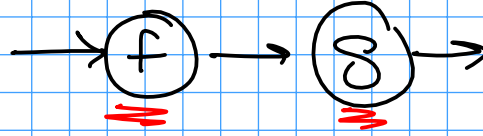


pipe (f, g)

$t_f = 10t$

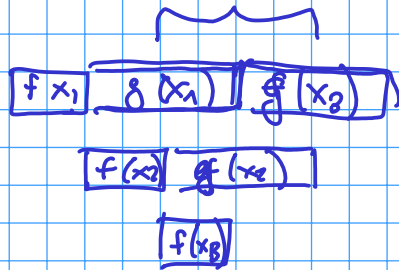
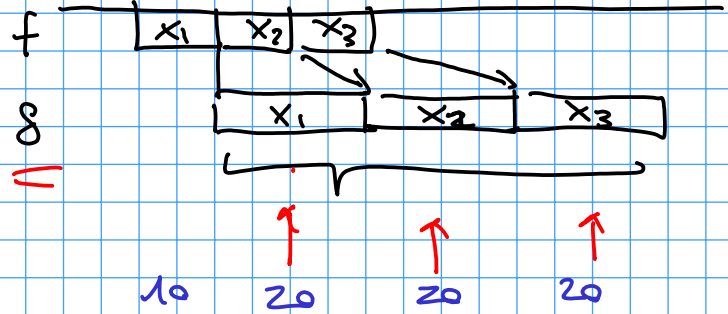
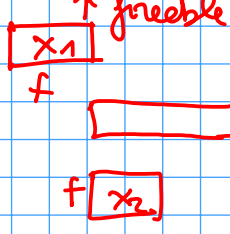
$t_g = 20t$

$x_1, x_2, x_3$



$T_S = 20t$

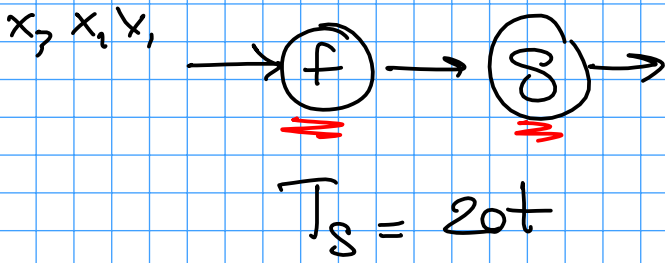
$x_1$   
 ↓  
 f readable  $f(x_1)$   
 ~ f readable  $g(x_1)$   
 ↑ f readable  $g(x_1)$



10 20 20



$$t_f = 10t \quad t_g = 20t$$



$$\text{pipe}(f, g)$$

$$\Delta \equiv \text{form}(\Delta)$$

$$\text{pipe}(f, \text{form}(g))$$

$mw=2$

