

⁰Based on earlier versions by Greg Michaelson and Patrick Maier

Skeletons Are Parallel Higher-Order Functions

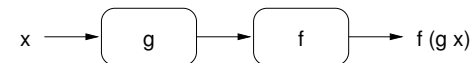
Observations:

- A *skeleton* (or any other template) is essentially a higher-order function (HOF), ie. a function taking functions as arguments.
 - ▶ Sequential code parameters are functional arguments.
- Skeleton implementation is parallelisation of HOF.
- Many well-known HOFs have parallel implementations.
 - ▶ Thinking in terms of higher-order functions (rather than explicit recursion) helps in discovering parallelism.

Consequences:

- Skeletons can be combined (by function composition).
- Skeletons can be nested (by passing skeletons as arguments).

Skeletons Are PHOFs — Pipeline



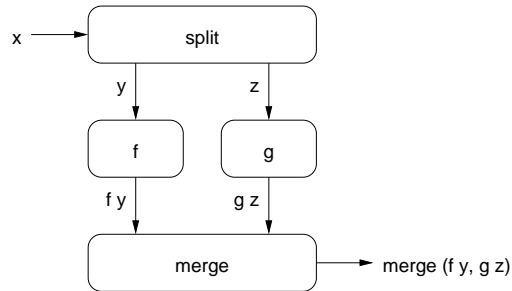
Code (parallel implementation in red)

```
pipe2 :: (b -> c) -> (a -> b) -> a -> c
pipe2 f g x = let y = g x in
               y `par` f y
```

Notes:

- pipe2 is also known as *function composition*.
- In Haskell, sequential function composition is written as `.` (read “dot”).

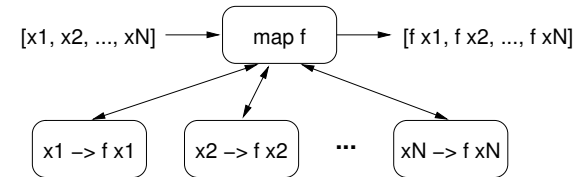
Skeletons Are PHOFs — Parallel Tasks



Code (parallel implementation in red)

```
task2 :: (a -> (b,c)) -> (d -> e -> f) -> (b -> d) -> (c -> e) -> a -> f
task2 split merge f g x = let (y,z) = split x
                             fy = f y
                             gz = g z in
                             fy `par` gz `pseq` merge fy gz
```

Skeletons Are PHOFs — Task Farm



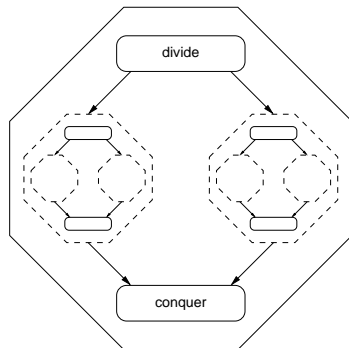
Code (parallel implementation in red)

```
farm :: (a -> b) -> [a] -> [b]
farm f [] = []
farm f (x:xs) = let fx = f x in
                 fx `par` fx : (farm f xs)
```

Notes:

- farm is also known as *parallel map*.
 - ▶ Map functions exist for many data types (not just lists).
- Missing in implementation: strategy to force eval of lazy list.
- Strategies also useful to increase granularity (by chunking).

Skeletons Are PHOFs — Divide & Conquer



Code (parallel implementation in red)

```
dnc :: (a -> (a,a)) -> (b -> b -> b) -> (a -> Bool) -> (a -> b) -> a -> b
dnc div conq atomic f x | atomic x = f x
                        | otherwise = let (l0,r0) = div x
                                         l = dnc div conq atomic f l0
                                         r = dnc div conq atomic f r0 in
                                         l `par` r `pseq` conq l r
```

Skeletons Are PHOFs — Divide & Conquer

Notes:

- Divide & Conquer is a generalised *parallel fold*.
 - ▶ Folds exist for many data types (not just lists).
- Missing in impl: strategies to force eval and improve granularity.

Aside: folding/reducing lists

```
fold :: (a -> a -> a) -> a -> [a] -> a
-- fold f e [x1,x2,...,xn] == e `f` x1 `f` x2 ... `f` xn, provided that
-- (1) f is associative, and
-- (2) e is an identity for f.
```

```
-- Tail-recursive sequential implementation:
fold f e [] = e
fold f e (x:xs) = fold f (e `f` x) xs
```

```
-- Parallel implementation as instance of divide & conquer:
fold f e = dnc split f atomic evalAtom where
  split xs = splitAt (length xs `div` 2) xs
  atomic [] = True
  atomic [_] = True
  atomic _ = False
  evalAtom [] = e
  evalAtom [x] = x
```

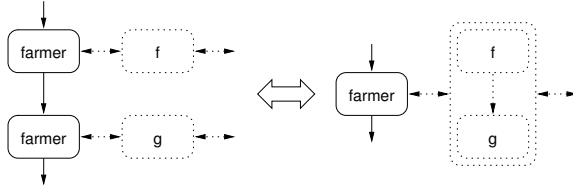
Program Transformations

Observation:

- HOFs can be transformed into other HOFs with provably equivalent (sequential) semantics.

Example: Pipeline of farms vs. farm of pipelines

- $\text{map } g \ . \ \text{map } f \ == \ \text{map } (g \ . \ f)$



- use $\text{map } g \ . \ \text{map } f$ (pipe of farms) if ratio comp/comm high
- use $\text{map } (g \ . \ f)$ (farm of pipes) if ratio comp/comm low
- More transformations in
 - ▶ G. Michaelson, N. Scaife. *Skeleton Realisations from Functional Prototypes*, Chap. 5 in S. Gorlatch and F. Rabhi (Eds), *Patterns and Skeletons for Parallel and Distributed Computing*, Springer, 2002

Program Development with Functional Skeletons

Programming Methodology:

- 1 Write seq code using HOFs with known equivalent skeleton.
- 2 Measure sequential processing cost of functions passed to HOFs.
- 3 Evaluate skeleton cost model.
- 4 If no useful parallelism, transform program and go back to 3.
- 5 Replace HOFs that display useful parallelism with their skeletons.

Tool support:

- Compilers can automate some steps (see Michaelson/Scaife)
 - ▶ Only for small, pre-selected set of skeletons
- Example: PMLS (developed by Greg Michaelson et al.)
 - ▶ Skeletons: map/fold (arbitrarily nested)
 - ▶ Automates steps 2-5.
 - ★ Step 2: automatic profiling
 - ★ Step 4: rule-driven program transformation + synthesis of HOFs
 - ★ Step 5: map/fold skeletons implemented in C+MPI