1 The algorithm

```
type Image = PA (PA Int)
type Hist = PA Int
hbalance :: Image -> Image
hbalance img =
 let a :: Hist
                                                         -- Histogram
      a = joinD
                                                         -- accu end
          . mapD (\((as,a) -> mapS (plusInt a) as)
          . propagateD plusInt 0
          . mapD (scanIS plusInt 0)
                                                         -- accu begin
          . sparseToDenseD (plusInt gmax 1) 0
                                                         -- hist end
          . splitSparseD (plusInt gmax 1)
          . joinD
          . mapD tripletToATup2
          . segdSplitMerge 0
          . sortPS
          . concatPS
                                                         -- hist begin
          $ img
                                                         -- 1
      \mathsf{n} \; :: \; \mathbf{Int}
      n = lengthPS a
                                                         -- 2
      a0, divisor, gmax':: Double
                                                         -- 3, variables for normalize and scale
           = int2Double . headPS $ a
      divisor = minusDouble (int2Double (lastPS a)) . int2Double . headPS $ a
      gmax' = int2Double $ gmax
      \mathsf{normScale} :: \mathbf{Int} \mathrel{-}{>} \mathbf{Int}
                                                         -- 0, body of normalize and scale
      normScale = floorDouble \;. \; (flip \; multDouble) \; gmax' \;. \; (flip \; divDouble) \; divisor \; \;. \; (flip \; minusDouble) \; a0 \;. \; int2Double
                                                         -- final mapping array
      as = joinD . mapD (mapS normScale) . splitD \ a -- 4, normalize and scale applied
      pixelReplicate :: Hist -> PA Hist
                                                         -- 0, artifact of NDP
      pixelReplicate = concatPS . repIPL (lengths (getSegd xs)) . repIPS (lengthPS img)
  in unconcatPS img
     . indexPL ( pixelReplicate as)
                                                         -- 5, apply. core of nested data parallelism here!
     . concatPS
     $ img
```

2 Work and Depth Table

- n sei die Anzahl der Bildpixel
- w sei die Bildbreite
- h sei die Bildhöhe
- p sei die Anzahl der PUs (gang members).

Table 1: Work and Depth complexities

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function or variable	O(W)	O(D)
hbalance	$\max(n\log n, gmax)$	$\log \max(n, gmax)$
hist	$\max(n\log n, gmax)$	$\log n$
accu	gmax	$\log gmax$
as	gmax	1
pixelReplicate	1 (bzw. $n \cdot gmax$)	1
img'	n	1
sortPS	$n \log n$	$\log n$
concatPS	1	1
unconcatPS	1	1
headPS,lastPS	1	1
replPS n x	n	1
replPL ns xs	sum(ns)*size(xs)	1
indexPL is xs	size(xs)	1
${\rm mapD\ tripletToATup2}$	$\max_{p} \frac{p}{p}$	1
${\rm segdSplitMerge}$	$n \log n^{r}$	$\log n$
mapD fS xs	W(fS, s) * size(xs)	W(fS,s)*size(xs)/p
lengthPS	1	1
joinD xs	size(xs)	1 (communication overhead?)
splitD xs	size(xs)	1 (communication overhead?)
propagateD xs	1	$\log size(xs)$
${\rm sparse To Dense D}$	gmax	1
splitSparseD	gmax	1

3 Calculating "hbalance" entirely

Let
$$n = |img| = w \cdot h$$

$$W(w \times h, gmax) = W(hist) + W(accu) + W(as) + W(pixelReplicate) + W(img')$$

$$= O(\max(n \log n, gmax) + gmax + gmax + 1 + n)$$

$$\in O(\max(n \log n, gmax))$$

$$D(w \times h, gmax) = \max\{hist, accu, as, pixelReplicate, img'\}$$

$$= \max\{\log n, \log gmax\}$$

$$\in O(\log \max(n, gmax))$$

$$(1)$$

4 Calculating the histogram "hist"

Let $n = |img| = w \cdot h$

$$\begin{split} \mathbf{W}(w \times h) &= \mathbf{W}(concatPS) + \mathbf{W}(sortPS) + \mathbf{W}(segdSplitMerge) \\ &+ \mathbf{W}(mapD, localSegdToTup2) + \mathbf{W}(joinD) \\ &= 1 + n\log n + n\log n + gmax + gmax \\ &= 1 + 2(n\log n + gmax) \\ &\in O(\max(n\log n, gmax)) \\ \mathbf{D}(w \times h) &= \max\{concatPS, sortPS, ..., joinD\} \\ &\in O(\log n) \end{split}$$

5 Calculating the accumulated histogram "accu"

$$\begin{split} & W(gmax) = W(splitSparseD) + W(sparseToDenseD) + W(mapD, scanlS) \\ & + W(propagateD) + W(mapD, mapS, plusInt) + W(joinD) \\ & = gmax + gmax + gmax + 1 + gmax + gmax \\ & = 1 + 5 \cdot gmax \\ & \in O(gmax) \\ & D(gmax) = \max\{splitSparseD, sparseToDenseD, (mapD, scanlS), \ldots\} \\ & \in O(\log gmax) \end{split}$$

6 Calculating the mapping array "as"

$$W(gmax) = W(joinD) + W(mapD, normScale) + W(splitD)$$

$$= gmax + gmax + gmax$$

$$= 3 \cdot gmax$$

$$\in O(gmax)$$

$$D(gmax) = \max\{joinD, (mapD, normScale), splitD\}$$

$$\in O(1)$$

$$(4)$$

7 Calculating by "pixelReplicate"

PixelReplicate is a function which executed strictly and literally would have a work complexity of $n \cdot gmax$. However, due to strong improvements in [WorkEfficient] this replication is simply cached locally such that the work complexity for this case is neglible and can be simplified to 1.

$$W(gmax, w \times h) \in O(1)$$

$$D(gmax, w \times h) \in O(1)$$
 (5)

8 Calculating the final balanced image "img'"

$$\begin{aligned} \mathbf{W}(gmax, w \times h) &= \mathbf{W}(unconcatPS) + \mathbf{W}(indexPL) + \mathbf{W}(concatPS) \\ &= 1 + n + 1 \\ &\in O(n) \\ \mathbf{D}(gmax, w \times h) &= \max\{unconcatPS, indexPL, concatPS\} \\ &\in O(1) \end{aligned} \tag{6}$$

9 Other aspects e.g. sync-points, programmer workload, simplicity

- optimisations: removed sync-points (more local operations), tight distributed normalisation loop, distributed optimal prefix-sum, distributed group P and sortP, nested data parallelism enables a depth lower than O(width)
- progammer-workload: as much as for P_{nest}
- simplicity: many details, not indented for human readers, but shows optimisations clearly