# Solexa QA report

November 10, 2008

#### 1 Overview

This document provides a quality assessment of Genome Analyzer results. The assessment is meant to complement, rather than replace, quality assessment available from the Genome Analyzer and its documentation. The narrative interpretation is based on experience of the package maintainer. It is applicable to results from the 'Genome Analyzer' hardware single-end module, configured to scan 300 tiles per lane. The 'control' results referred to below are from analysis of  $\varphi$ X-174 sequence provided by Illumina.

An R script containing the code used in this document can be created with

```
> fl <- system.file("template", "qa_solexa.Rnw", package = "ShortRead")
> Stangle(fl)
```

#### 2 Run summary

Read counts. Filtered and aligned read counts are reported relative to the total number of reads (clusters). Consult Genome Analyzer documentation for official guidelines. From experience, very good runs of the Genome Analyzer 'control' lane result in 6-8 million reads, with up to 80% passing pre-defined filters.

```
> ppnCount(qa[["readCounts"]])
```

	read	filtered	aligned
<pre>s_1_1_export.txt</pre>	3668433	0.621	0.521
<pre>s_2_1_export.txt</pre>	4230424	0.766	0.655
<pre>s_3_1_export.txt</pre>	4003465	0.772	0.430
<pre>s_4_1_export.txt</pre>	4521919	0.762	0.569
<pre>s_6_1_export.txt</pre>	4004807	0.781	0.496
$s_7_1_export.txt$	3546869	0.771	0.386
$s_8_1_export.txt$	4232977	0.778	0.562
$s_5_1_export.txt$	2842633	0.844	0.816

Base call frequency over all reads. Base frequencies should accurately reflect the frequencies of the regions sequenced.

> qa[["baseCalls"]]/rowSums(qa[["baseCalls"]])

	А	С	G	Т	N
<pre>s_1_1_export.txt</pre>	0.241	0.225	0.207	0.238	0.0893
<pre>s_2_1_export.txt</pre>	0.245	0.235	0.229	0.232	0.0598
$s_3_1_export.txt$	0.242	0.244	0.237	0.223	0.0546
<pre>s_4_1_export.txt</pre>	0.244	0.243	0.236	0.226	0.0509
<pre>s_6_1_export.txt</pre>	0.237	0.254	0.248	0.213	0.0478
<pre>s_7_1_export.txt</pre>	0.248	0.249	0.238	0.219	0.0453
<pre>s_8_1_export.txt</pre>	0.234	0.253	0.245	0.222	0.0452
$s_5_1_export.txt$	0.284	0.211	0.205	0.251	0.0490

Overall read quality. Lanes with consistently good quality reads have strong peaks at the right of the panel.

```
> df <- qa[["readQualityScore"]]
> print(plotReadQuality(df[df$type == "read", ]))
```



# 3 Read distribution

These curves show how coverage is distributed amongst reads. Ideally, the cumulative proportion of reads will transition sharply from low to high.

Portions to the left of the transition might correspond roughly to sequencing or sample processing errors, and correspond to reads that are represented relatively infrequently. 10-15% of reads in a typical Genome Analyzer 'control' lane fall in this category.

Portions to the right of the transition represent reads that are over-represented compared to expectation. These might include inadvertently sequenced primer or adapter sequences, sequencing or base calling artifacts (e.g., poly-A reads), or features of the sample DNA (highly repeated regions) not adequately removed during sample preparation. About 5% of Genome Analyzer 'control' lane reads fall in this category.

Broad transitions from low to high cumulative proportion of reads may reflect sequencing bias or (perhaps intentional) features of sample preparation resulting in non-uniform coverage. the transition is about 5 times as wide as expected from uniform sampling across the Genome Analyzer 'control' lane.

> df <- qa[["sequenceDistribution"]]
> print(plotReadOccurrences(df[df\$type == "read", ], cex = 0.5))



Common duplicate reads might provide clues to the source of over-represented sequences. Some of these reads are filtered by the alignment algorithms; other duplicate reads might point to sample preparation issues.

> freqSequences(qa, "read")

	sequence	count	lane
1051	ААААААААААААААААААААААААААААААААААААА	70947	<pre>s_5_1_export.txt</pre>
451	ААААААААААААААААААААААААААААААААААААА	69116	<pre>s_4_1_export.txt</pre>
601	АААААААААААААААААААААААААААААААААААА	66776	<pre>s_6_1_export.txt</pre>
301	АААААААААААААААААААААААААААААААААААА	63998	<pre>s_3_1_export.txt</pre>
751	АААААААААААААААААААААААААААААААААААА	55729	<pre>s_7_1_export.txt</pre>
151	АААААААААААААААААААААААААААААААААААА	54828	<pre>s_2_1_export.txt</pre>
901	АААААААААААААААААААААААААААААААААААА	40359	<pre>s_8_1_export.txt</pre>
1	ANNNNNNNNNNNNNNNNNNNNNNNNNNNNNNNN	30880	<pre>s_1_1_export.txt</pre>
152	ANNNNNNNNNNNNNNNNNNNNNNNNNNNNNNNN	30485	<pre>s_2_1_export.txt</pre>
153	CNNNNNNNNNNNNNNNNNNNNNNNNNNNNNNN	26476	<pre>s_2_1_export.txt</pre>
2	TNNNNNNNNNNNNNNNNNNNNNNNNNNNNNNN	25600	<pre>s_1_1_export.txt</pre>
154	GNNNNNNNNNNNNNNNNNNNNNNNNNNNNNNN	25594	<pre>s_2_1_export.txt</pre>
3	CNNNNNNNNNNNNNNNNNNNNNNNNNNNNNNNNN	25063	<pre>s_1_1_export.txt</pre>
155	TNNNNNNNNNNNNNNNNNNNNNNNNNNNNNNNNN	24965	<pre>s_2_1_export.txt</pre>
4	GNNNNNNNNNNNNNNNNNNNNNNNNNNNNNN	24164	<pre>s_1_1_export.txt</pre>
302	ANNNNNNNNNNNNNNNNNNNNNNNNNNNNNNNNN	22501	<pre>s_3_1_export.txt</pre>
5	АААААААААААААААААААААААААААААААААААА	20996	<pre>s_1_1_export.txt</pre>
452	TNNNNNNNNNNNNNNNNNNNNNNNNNNNNNN	20842	<pre>s_4_1_export.txt</pre>
303	CNNNNNNNNNNNNNNNNNNNNNNNNNNNNNN	20227	<pre>s_3_1_export.txt</pre>
304	GNNNNNNNNNNNNNNNNNNNNNNNNNNNNN	19845	s_3_1_export.txt

Common duplicate reads after filtering

> freqSequences(qa, "filtered")

	sequence	$\operatorname{count}$	lane
1151	GACGTTTGGTCAGTTCCATCAACATCATAGCCAGA	439	<pre>s_5_1_export.txt</pre>
1152	CAAATGACGACTTCTACCACATCTATTGACATTAT	438	<pre>s_5_1_export.txt</pre>
1153	CGAAAGACCAGGTATATGCACAAAATGAGATGCTT	435	<pre>s_5_1_export.txt</pre>
1154	AAGTAAAGGACGGTTGTCAGCGTCATAAGAGGTTT	433	<pre>s_5_1_export.txt</pre>
1155	ATTTGGACTGCTCCGCTTCCTCCTGAGACTGAGCT	419	<pre>s_5_1_export.txt</pre>
1156	AAATGACGACTTCTACCACATCTATTGACATTATG	416	<pre>s_5_1_export.txt</pre>
1157	GACTTCTACCACATCTATTGACATTATGGGTCTGC	413	<pre>s_5_1_export.txt</pre>
1158	ATCATAGCCAGATGCCCAGAGATTAGAGCGCATGA	410	<pre>s_5_1_export.txt</pre>
1159	AACATCATAGCCAGATGCCCAGAGATTAGAGCGCA	409	<pre>s_5_1_export.txt</pre>
1160	TGATGAACTAAGTCAACCTCAGCACTAACCTTGCG	402	<pre>s_5_1_export.txt</pre>
1161	TGCTCCGCTTCCTCCTGAGACTGAGCTTTCTCGCC	401	<pre>s_5_1_export.txt</pre>
1162	AAGCTGCTTATGCTAATTTGCATACTGACCAAGAA	398	<pre>s_5_1_export.txt</pre>
1163	TGCGTAACCGTCTTCTCGTTCTCTAAAAACCATTT	398	<pre>s_5_1_export.txt</pre>
1164	AACGACGTTTGGTCAGTTCCATCAACATCATAGCC	397	<pre>s_5_1_export.txt</pre>
1165	GTTTGGTCAGTTCCATCAACATCATAGCCAGATGC	394	<pre>s_5_1_export.txt</pre>
1166	AAGGTGATGTGCTTGCTACCGATAACAATACTGTA	391	<pre>s_5_1_export.txt</pre>
1167	GACCAGAAAACTGGCCTAACGACGTTTGGTCAGTT	385	<pre>s_5_1_export.txt</pre>
1168	GACGACTTCTACCACATCTATTGACATTATGGGTC	385	<pre>s_5_1_export.txt</pre>
1169	GCCGTGGATGCCTGACCGTACCGAGGCTAACCCTA	383	<pre>s_5_1_export.txt</pre>
1170	AAAGACCAGGTATATGCACAAAATGAGATGCTTGC	381	<pre>s_5_1_export.txt</pre>

## 4 Cycle-specific base calls and read quality

Per-cycle base call should usually be approximately uniform across cycles. Genome Analyzer 'control' lane results often show a deline in A and increase in T as cycles progress. This is likely an artifact of the underlying technology.

```
> perCycle <- qa[["perCycle"]]</pre>
```

> print(plotCycleBaseCall(perCycle\$baseCall))



Per-cycle quality score. Reported quality scores are 'calibrated', i.e., incorporating phred-like adjustments following sequence alignment. These typically decline with cycle, in an accelerating manner. Abrupt transitions in quality between cycles toward the end of the read might result when only some of the cycles are used for alignment: the cycles included in the alignment are calibrated more effectively than the reads excluded from the alignment.

> print(plotCycleQuality(perCycle\$quality))



### 5 Tile performance

Counts per tile. Dashed red line indicates the 10% of tiles with fewest reads. An approximately uniform distribution suggests consistent read representation in each tile. Distinct separation of 'good' versus poor quality tiles might suggest systematic failure, e.g., of many tiles in a lane, or excessive variability (e.g., due to unintended differences in sample DNA concentration) in read number per lane.

```
> perTile <- qa[["perTile"]]
> readCnt <- perTile[["readCounts"]]
> cnts <- readCnt[readCnt$type == "read", "count"]
> print(histogram(cnts, breaks = 40, xlab = "Reads per tile", panel = function(x,
+ ...) {
+ panel.abline(v = quantile(x, 0.1), col = "red", lty = 2)
+ panel.histogram(x, ...)
+ }, col = "white"))
```



Spatial counts per tile. Divisions on the color scale are quantized, so that the range of counts per tile is divided into 10 equal increments. Parenthetic numbers on the scale represent the break points of the quantized values. Because the scale is quantized, some tiles will necessarily have 'few' reads and other necessarily 'many' reads.

Consistent differences in read number per lane will result in some lanes being primarily one color, other lanes primarily another color. Genome Analyzer data typically have greatest read counts in the center column of each lane. There are usually consistent gradients from 'top' to 'bottom' of each column.

Low count numbers in the same tile across runs of the same flow cell may indicate instrumentation issues.

> print(plotTileCounts(readCnt[readCnt\$type == "read", ]))



Median read quality score per tile. Divisions on the color scale are quantized, so that the range of average quality scores per tile is divided into 10 equal increments. Parenthetic numbers on the scale represent the break points of the quantized values.

Often, quality and count show an inverse relation.

- > qscore <- perTile[["medianReadQualityScore"]]</pre>
- > print(plotTileQualityScore(qscore[qscore\$type == "read", ]))



# 6 Alignment

Mapped alignment score. Counts measured relative to counts in score category with maximum representation. Successful alignments will be reflected in a strong peak to the right of each panel.

> print(plotAlignQuality(qa[["alignQuality"]]))



## A Report-specific functions

```
> ppnCount <- function(m) {</pre>
      ## scale subsequent columns to be proportions of
+
+
      ## first column
      m[,-1] <- m[,-1] / m[,1]
+
+
      т
+ }
  .laneLbl <- function(lane) sub("s_(.*)_.*", "\\1", lane)</pre>
>
  plotReadQuality <- function(df) {</pre>
>
+
      df$lane <- .laneLbl(df$lane)</pre>
+
      xyplot(density~quality/lane, df,
+
              type="l",
              xlab="Average (calibrated) base quality",
+
+
              ylab="Proportion of reads",
+
              aspect=2)
+ }
 plotReadOccurrences <- function(df, ...) {</pre>
>
      df$lane <- .laneLbl(df$lane)</pre>
+
+
      df <- with(df, {</pre>
           nOccur <- tapply(nOccurrences, lane, c)</pre>
+
```

```
cumulative <- tapply(nOccurrences*nReads, lane, function(elt) {</pre>
+
               cs <- cumsum(elt)</pre>
+
               (cs-cs[1] + 1) / diff(range(cs))
           })
+
+
           lane <- tapply(lane, lane, c)</pre>
+
           data.frame(nOccurrences=unlist(nOccur),
                       cumulative=unlist(cumulative),
+
                       lane=unlist(lane))
+
      })
+
      xyplot(cumulative~log10(nOccurrences)|factor(lane), df,
+
+
              xlab=expression(paste(
                   "Number of occurrences of each read (",
+
                  log[10], ")", sep="")),
+
+
              ylab="Cumulative proportion of reads",
+
              aspect=2, type="l", ...)
+ }
> freqSequences <- function(qa, read, n=20)</pre>
+ {
      cnt <- qa[["readCounts"]]</pre>
+
      df <- qa[["frequentSequences"]]</pre>
      df1 <- df[df$type==read,]</pre>
+
      df1[["ppn"]] <- df1[["count"]] / cnt[df1[["lane"]], read]
      head(df1[order(df1$count, decreasing=TRUE),
+
                c("sequence", "count", "lane")], n)
+ }
> plotAlignQuality <- function(df) {</pre>
      df$lane <- .laneLbl(df$lane)</pre>
+
      xyplot(count<sup>~</sup>score|lane, df,
+
+
              type="l",
              prepanel=function(x, y, ...) {
                  list(ylim=c(0, 1))
              },
              panel=function(x, y, ...) {
                  panel.xyplot(x, y/max(y), ...)
+
              },
              xlab="Alignment quality score",
+
+
              ylab="Number of alignments, relative to lane maximum",
+
              aspect=2)
+ }
> .plotTileLocalCoords <- function(tile, nrow) {</pre>
      row <- 1 + (tile - 1) %% nrow
+
      col <- 1 + floor((tile -1) / nrow)</pre>
+
      row[col%2==0] <- nrow + 1 - row[col%2==0]
      list(row=as.integer(row), col=as.factor(col))
+
+ }
> .atQuantile <- function(x, breaks)</pre>
```

```
+ {
      at <- unique(quantile(x, breaks))</pre>
+
+
      if (length(at)==1)
           at <- at * c(.9, 1.1)
+
+
      at
+ }
> .colorkeyNames <- function(at, fmt) {</pre>
      paste(names(at), " (", sprintf(fmt, at), ")", sep="")
+
+ }
> plotTileCounts <- function(df, nrow=100) {</pre>
      df <- df[!is.na(df$count),]</pre>
+
      xy <- .plotTileLocalCoords(df$tile, nrow)</pre>
+
      df[,names(xy)] <- xy</pre>
+
      at <- .atQuantile(df$count, seq(0, 1, .1))</pre>
      df$lane <- .laneLbl(df$lane)</pre>
      levelplot(cut(count, at)~col*row|lane, df,
+
                 main="Read count (percentile rank)",
                 xlab="Tile x-coordinate",
+
                 ylab="Tile y-coordinate",
+
+
                  cuts=length(at)-2,
+
                  colorkey=list(
+
                    labels=.colorkeyNames(at, "%d")),
+
                  aspect=2)
+ }
> plotTileQualityScore <- function(df, nrow=100) {</pre>
      df <- df[!is.na(df$score),]</pre>
      xy <- .plotTileLocalCoords(df$tile, nrow)</pre>
+
+
      df[,names(xy)] <- xy</pre>
      at <- .atQuantile(df$score, seq(0, 1, .1))</pre>
      df$lane <- .laneLbl(df$lane)</pre>
      levelplot(cut(score, at)~col*row|lane, df,
                 main="Read quality (percentile rank)",
                 xlab="Tile x-coordinate",
+
+
                 ylab="Tile y-coordinate",
+
                  cuts=length(at)-2,
                  colorkey=list(
+
+
                    labels=.colorkeyNames(at, "%.2f")),
+
                  aspect=2)
+ }
> plotCycleBaseCall <- function(df) {</pre>
      col <- rep(c("red", "blue"), 2)</pre>
+
+
      lty <- rep(1:2, each=2)
      df <- df[df$Base != "N",]</pre>
+
      df$lane <- .laneLbl(df$lane)</pre>
+
      xyplot(log10(Count)~as.integer(Cycle)|lane,
+
              group=factor(Base), df,
```

```
type="l", col=col, lty=lty,
+
+
             key=list(space="top",
+
               lines=list(col=col, lty=lty),
+
                text=list(lab=as.character(unique(df$Base))),
+
                columns=length(unique(df$Base))),
+
             xlab="Cycle",
+
             aspect=2)
+ }
> plotCycleQuality <- function(df)</pre>
+ {
      qnum <- as(SFastqQuality(as.character(df$Quality)), "numeric")</pre>
+
      df$qtot <- qnum * df$Count
+
+
      aveScore <- with(df,
+
                        tapply(qtot, list(lane, Cycle), sum) /
+
                        tapply(Count, list(lane, Cycle), sum))
+
      score <- data.frame(AverageScore=as.vector(aveScore),</pre>
+
                           Cycle=as.vector(col(aveScore)),
+
+
                           Lane=.laneLbl(rownames(aveScore)))
+
      xyplot(AverageScore~Cycle | Lane, score,
             ylab="Average score",
+
+
             aspect=2)
+ }
```