## WEB TOOL



## illuminaio: An open source IDAT parsing tool for Illumina

microarrays [v1; ref status: indexed, http://f1000r.es/2f5]

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### Abstract

The IDAT file format is used to store BeadArray data from the myriad of genomewide profiling platforms on offer from Illumina Inc. This proprietary format is output directly from the scanner and stores summary intensities for each probe-type on an array in a compact manner. A lack of open source tools to process IDAT files has hampered their uptake by the research community beyond the standard step of using the vendor's software to extract the data they contain in a human readable text format. To fill this void, we have developed the illuminaio package that parses IDAT files from any BeadArray platform, including the decryption of files from Illumina's gene expression arrays. illuminaio provides the first open-source package for this task, and will promote wider uptake of the IDAT format as a standard for sharing Illumina BeadArray data in public databases, in the same way that the CEL file serves as the standard for the Affymetrix platform.

## **Article Status Summary**

### Referee Responses

Referees	1	2
<b>v1</b> published 04 Dec 2013	report 1	report 1

1 Jan Oosting, Leiden University Medical Center Netherlands

2 Tiffany Morris, University College London UK

### Latest Comments

No Comments Yet

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### Introduction

The DNA microarray field is dominated by the three manufacturers: Affymetrix, Illumina and Agilent. While the basic premise behind their competing products is the same (i.e. the measurement of hybridisation between sample and immobilised probes on arrays via fluorescence), the formats in which these data are presented to end users are quite different, with each manufacturer electing to use their own proprietary format. The most ubiquitous of these is the CEL file, which has been accepted as a standard format for publishing the raw data generated on the Affymetrix platform. A search of the Gene Expression Omnibus (GEO, http://www.ncbi.nlm.nih. gov/geo/) database finds over 90% of submissions of Affymetrix data include one or more CEL files as supplementary material. The format itself is well documented by the manufacturer, who also provides an open-source software development kit (SDK). As a result, in addition to Affymetrix's own software suite, a large number of CEL parsing tools exist, including a parser implemented based on the file format documentation:  $affyio^1$  and a parser based on the SDK: *affxparser*<sup>2</sup>.

The same is not true of the primary IDAT format from Illumina, with only 1.5% (49 out of 3208) of the submissions in GEO that use Illumina BeadArrays including IDAT files as supplementary material. Given that IDATs are the standard file type generated during BeadArray processing, it seems reasonable to assume that the relative dearth of IDAT files in the public domain is due to the lack of widespread support for the format. The development of alternative parsing tools has proven more challenging for IDATs for a number of reasons. The foremost amongst these is a lack of public documentation, leaving tool developers to determine the file structure themselves. A further hurdle has been the encryption of IDAT files generated from expression chips. These barriers initially left researchers reliant on the output from Illumina's GenomeStudio software to convert the data into a more convenient format. Existing open source tools, particularly those that focus on gene expression analysis such as *beadarray*<sup>3</sup>, *lumi*<sup>4</sup> and *limma*<sup>5</sup>, all require that the IDAT files have been processed using GenomeStudio to generate a plain-text ASCII file before any analysis can take place (Figure 1). The GenePattern<sup>6</sup> software suite includes support for reading expression IDAT files, although it is limited to extracting only a subset of the array information. GenomeStudio output also omits various information that is available from the IDAT, such as control probe intensities (for SNP and methylation platforms), so-called out-ofband probes (methylation 450k)<sup>7</sup> and meta information including software versions and scan date (all platforms).

Here we introduce the Bioconductor<sup>8</sup> package *illuminaio* that can handle IDAT files from any Illumina BeadArray platform, providing a simple unified interface to various low-level data extraction routines.

### **Data format**

The IDAT file format varies depending upon the array platform (Table 1). IDATs generated during the scanning of genotyping and methylation BeadArrays are binary files (one for each of the red and green channels). The bulk of each file is comprised of four fields: the ID of each bead-type on the array, the mean and standard

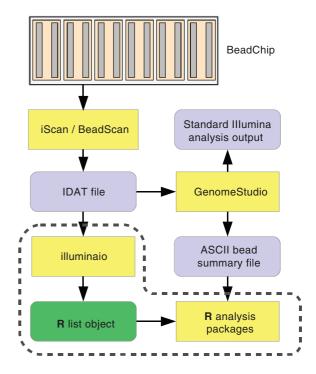


Figure 1. A typical BeadArray analysis workflow. Scanning of BeadChips is performed using the iScan or BeadScan control software, producing IDAT files. Currently, these are read by GenomeStudio where the user has the choice of performing an analysis using that software, or outputting the intensities to a text file for processing by alternative means. *illuminaio* removes this reliance on GenomeStudio. The intention is for analysis packages to incorporate its routines, effectively merging the dashed region and simplifying the analysis process for end users.

deviation of their intensities, and the number of beads of each type. Additionally, metadata including the date the array was scanned, specific software versions used and the type of BeadChip are also included. Once the structure of the file is understood these binary values can be read directly.

On the other hand, gene expression IDAT files are produced as encrypted XML files. Once decrypted the majority of the data are found as ten Base64 encoded strings. These ten fields include the ID, mean and standard deviation values as found in genotyping IDATs, as well as median and trimmed-mean intensity values, the mean and standard deviation of local background intensities, and the number of beads both before and after outliers have been excluded.

Each array type is also associated with a manifest file (with file extension BPM or BGX) that provides details of probe sequences, intended genomic targets and whether it is a control probe or not, information that is necessary to correctly interpret the data.

### Implementation

*illuminaio* is an R package<sup>9</sup>. The reading of IDAT files is achieved using the readIDAT function. This routine is able to determine

Table 1. Summarising the file formats for various BeadArray platforms.

Array type	File format	No. data fields
SNP genotyping	Binary	4
Methylation	Binary	4
Gene expression	Encrypted XML	10

the type of IDAT file that has been passed and calls the appropriate code to read the file and return the data as a R list object (Figure 1). This not only contains intensity data, but also the meta information such as scan date that are not routinely extracted and can be useful for detecting batch effects<sup>10</sup>.

Decryption of expression IDATs is performed using the opensource DES decryption routine available in *Gnulib*<sup>11</sup>. There is no official documentation of this file format, but *illuminaio* includes a document describing our findings in detail. Source code for the appropriate routines has been adapted and included in *illuminaio*, removing any requirement for specific external libraries to be installed on a user's computer. Thus the package can be built and run on all three major operating systems (Linux, Windows and Mac).

The *illuminaio* package also supports the parsing of non-encrypted IDAT files compressed by gzip and the reading of manifest files describing the array design (readBGX and readBPM).

The summarised intensity values obtained by *illuminaio* are nearly identical to those reported using *GenomeStudio*. Small discrepancies related to rounding performed by *GenomeStudio* are observed. The package vignette contains a detailed comparison. The time taken to read an IDAT depends on the platform, with encrypted expression arrays taking around 1 second per file (for 50,000 probes), and methylation and SNP platforms between 1 to 6 seconds depending on the chip density (which can range between a few hundred thousand and several million probes).

### Discussion

The availability of an open-source IDAT reader through *illuminaio* that can read files from any of Illumina's BeadArray technologies will promote greater use of the IDAT file as a primary data format in the analysis and sharing of results from BeadArray based profiling studies. The *illuminaio* package is intended for use by developers

to efficiently extract the content of both IDAT and bead-manifest files, thereby expanding the possibilities for conducting reproducible research with these data.

One exception to the dearth of IDAT files noted in the introduction is the The Cancer Genome Atlas (TCGA, http://cancergenome. nih.gov/). IDAT files from Illumina methylation and genotyping arrays are available in large numbers as Tier 1 data from the TCGA website (https://tcga-data.nci.nih.gov/tcga/). Of particular interest is the Illumina 450k methylation array, for which Triche *et al.*<sup>7</sup> has shown improvements in background correction by using outof-band probes, information that is only available through IDAT files and not the GenomeStudio output. For this work Triche *et al.* used *illuminaio* to access the out-of-band probes, which shows the advantage of having access to low-level data.

*illuminaio* is currently used in the *minfi*<sup>12</sup>, *methylumi*<sup>13</sup> and *crlmm*<sup>14,15</sup> packages for importing IDAT files from the Infinium methylation and genotyping platforms respectively, demonstrating its utility.

### Software availability

*illuminaio* is an R package available from the Bioconductor project (http://www.bioconductor.org) and from 10.5281/zenodo.7588.

### Author contributions

KAB developed the first version of the IDAT reader for unencrypted IDAT files. This work was later improved by HB, MER and KDH. MLS developed the IDAT reader for encrypted files. All authors wrote and approved the manuscript.

### Competing interests

No competing interests were disclosed.

### Grant information

This work was supported by the European Community's Seventh Framework Programme under grant agreement No. 305626 (Project RADIANT) (MLS), NHMRC Project grant 1050661, Victorian State Government Operational Infrastructure Support and Australian Government NHMRC IRIISS (MER) and Grant Number R01 GM103552 from the National Institute of General Medical Sciences, National Institutes of Health (KDH).

The funders had no role in study design, data collection and analysis, decision to publish, or preparation of the manuscript.

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# Current Referee Status: 🗹 🗹



## **Referee Responses for Version 1**



## **Tiffany Morris**

UCL Cancer Institute, University College London, London, UK

## Approved: 29 January 2014

## Referee Report: 29 January 2014

This manuscript written by Smith et al. presents an R package to process IDAT files, the file format of Illumina BeadArrays. The package illuminaio fills an important gap in data processing by enabling the analysis of Illumina data without Illumina software. The gap is illustrated when the authors cite the disparity between the availability of CEL files (Affymetrix file format) and IDAT files in public data repositories. In addition to eliminating the need to use Illumina software, illuminaio extracts additional information from the IDAT files allowing improved quality control analyses and additional data correction algorithms. Figure 1 of the manuscript illustrates the simplified analysis pipeline enabled by illuminaio.

The authors briefly describe the IDAT file format that was not publically documented before *illuminaio*. Figure 2 of the manuscript summarises the details of the file format for each of the BeadArray platforms. As such this is not just the development of a new tool, as the authors have provided thorough documentation for a widely used platform. In addition, the vignette accompanying illuminaio clearly explains the packages methods and how to use them.

This package, illuminaio, has already led to the development of many new analysis packages that utilise IDAT files and the additional information they provide. In turn these packages are leading to the increased exchange and availability of the raw IDAT files in collaborations and data repositories.

## I have read this submission. I believe that I have an appropriate level of expertise to confirm that it is of an acceptable scientific standard.

Competing Interests: No competing interests were disclosed.

## 1 Comment

## **Author Response**

Kasper Hansen, khansen@jhsph.edu, USA Posted: 06 Feb 2014

Dr. Morris,

Thank you for your positive review. We are happy that you find our tool useful.

Best,

Kasper D. Hansen

Competing Interests: No competing interests were disclosed.



## **Jan Oosting**

Department of Pathology, Leiden University Medical Center, Leiden, Netherlands

## Approved: 27 January 2014

## Referee Report: 27 January 2014

The article describes illuminaio, an R package to process the raw data files produced by the Illumina scanning software. This tool is valuable, because it enables researchers to use a completely open analysis workflow, without having to use a closed source, blackbox, analysis step.

I have tried the package on IDAT files from several chiptypes, and only files from the beginning of 2005 scanned with beadscan 2.2 were rejected. Files scanned with beadscan 2.3 (Nov 2005) and onwards were processed properly.

I have read this submission. I believe that I have an appropriate level of expertise to confirm that it is of an acceptable scientific standard.

Competing Interests: No competing interests were disclosed.

## 1 Comment

## **Author Response**

Kasper Hansen, khansen@jhsph.edu, USA Posted: 06 Feb 2014

Dr. Oosting,

Thank you for your review. I am especially happy that you have taken the effort to apply illuminaio on output from older versions of beadscan.

We have contacted Dr. Oosting offline and have received a number of files from old scans. We have started implementing support for these older files, and initial results are promising. We expect to release a new version of illuminaio shortly, which will read these files.

Best, Kasper D. Hansen *Competing Interests:* No competing interests were disclosed.