DATA NOTE

A curated transcriptome dataset collection to investigate inborn errors of immunity [version 1; peer review: 1 approved with reservations]

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Abstract
Primary immunodeficiencies (PIDs) are a heterogeneous group of inherited disorders, frequently caused by loss-of-function and less commonly by gain-of-function mutations, which can result in susceptibility to a broad or a very narrow range of infections but also in inflammatory, allergic or malignant diseases. Owing to the wide range in clinical manifestations and variability in penetrance and expressivity, there is an urgent need to better understand the underlying molecular, cellular and immunological phenotypes in PID patients in order to improve clinical diagnosis and management. Here we have compiled a manually curated collection of public transcriptome datasets mainly obtained from human whole blood, peripheral blood mononuclear cells (PBMCs) or fibroblasts of patients with PIDs and of control subjects for subsequent meta-analysis, query and interpretation. A total of nineteen (19) datasets derived from studies of PID patients were identified and retrieved from the NCBI Gene Expression Omnibus (GEO) database and loaded in GXB, a custom web application designed for interactive query and visualization of integrated large-scale data. The dataset collection includes samples from well characterized PID patients that were stimulated ex vivo under a variety of conditions to assess the molecular consequences of the underlying, naturally occurring gene defects on a genome-wide scale. Multiple sample groupings and rank lists were generated to facilitate comparisons of the transcriptional responses between different PID patients and control subjects. The GXB tool enables browsing of a single transcript across studies, thereby providing new perspectives on the role of a given molecule across biological systems and PID patients. This dataset collection is available at http://pid.gxbsidra.org/dm3/geneBrowser/list.

Keywords
Transcriptomics, microarray, primary immunodeficiency disorders, inborn errors of immunity.

This article is included in the Sidra Medicine gateway.
This article is included in the Data: Use and Reuse collection.

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Introduction

Primary immunodeficiencies (PIDs) are a heterogeneous group of inherited disorders, most often caused by loss-of-function mutations and less commonly by gain-of-function mutations, affecting components of the innate and/or adaptive immune system\(^1\). These inborn errors of immunity can result in profoundly increased susceptibility to a broad or a very narrow range of infections but also autoimmune disorders, allergies and malignancies\(^2,4,6\). The spectrum of clinical manifestations of PIDs is very broad and largely dependent upon the affected gene(s) and the degree to which normal gene function is lost or altered. In addition, a variety of other factors such as germline or somatic mosaicism, modifier genes and environmental factors can play an important role in the clinical penetrance and expressivity of a given disease phenotype\(^3,7,8\). To date, mutations in more than 300 genes have been identified to cause PIDs, which are classified into major groups reflecting the diverse immunological phenotypes\(^5,9\). Nonetheless, PIDs often go unrecognized or are not properly diagnosed\(^6\). However, with the recent developments and rapidly declining costs of next-generation sequencing technologies and other high-throughput methods, it is expected that many more as yet unknown disease-related genetic variants will be discovered in the near future\(^6\).

A considerable challenge for identifying causal genetic variants—which is critical for the diagnosis and clinical management of PID patients—lies in the vast heterogeneity of the underlying immunological phenotypes and clinical manifestations on the one hand and in the degree of human genetic variation between individuals on the other hand. Despite considerable advances in recent years, specific gene functions in humans, their roles and regulation in biological processes, and essentiality of the redundancy in a function of a particular gene for protective immunity of the human host remains poorly understood\(^6\). In many cases, the use of forward and reverse genetics in mice or other model organisms has provided insufficient insights into the pathophysiology of PIDs, this due to interspecies differences and the fact that inbreeding has led to various deficiencies in laboratory animals, rendering them susceptible to a broad range of infections that often poorly recapitulates the clinical phenotypes in humans\(^1\). On the other hand, studying naturally occurring genetic defects in humans is much more challenging given the difficulty of obtaining biological samples, ethical implications and potential risks that go along with it. An additional challenge is the low frequency of most null alleles. Although PIDs are not necessarily rare when considered collectively, the small number of individuals that suffer from a specific deficiency usually does not permit classic case-control or family-based genetic association studies. Indeed, a considerable proportion of monogenic etiologies of PIDs were initially reported in single patients\(^1\). The ability to identify single-gene inborn errors in PID patients requires validation of the disease-causing variant by in-depth mechanistic studies demonstrating the structural and functional consequences of the mutations using blood or other accessible biological samples such as fibroblasts from skin biopsies\(^2\). In this context, several transcriptomics studies have been conducted using whole blood, PBMCs and fibroblasts of well-characterized PID patients, to assess the underlying immunological phenotypes at the molecular and cellular levels in more detail (Table 1) and in many cases, to further validate the causal relationship between the underlying genotypes and clinical phenotypes. Notable are several seminal studies of PID patients with susceptibility to a very narrow range of pathogens, such as patients with MYD88 or IRAK4 deficiency who are primarily susceptible to pyrogenic bacterial infections\(^13,14\), patients with TBK1, TRIF or TLR3 deficiency\(^15-17\) which underlies herpes simplex encephalitis of childhood, or a recent study of a child with IRF7 deficiency who was primarily susceptible to severe influenza but otherwise immunocompetent with regard to other common infectious diseases\(^18\). Such studies have highlighted that often, the underlying gene defect may only affect a narrow repertoire of transcriptional responses while the affected individual’s cells remain highly responsive to specific stimulation through alternative receptors, pathways and signaling networks and in particular to ex vivo stimulation with whole organisms, reflecting the high degree of human gene redundancy in host defenses\(^6\).

Here, we compiled a curated collection of 19 transcriptome datasets, retrieved from the NCBI’s Gene Expression Omnibus (GEO) database, to provide as resource for the investigation on inborn errors of immunity. The datasets were loaded into a custom interactive web application, the Gene Expression Browser (GXB), (http://pid.gxbsidra.org/dm3/geneBrowser/list), which allows seamless access to the data and interactive visualization of the transcriptional responses, along with demographic and clinical information\(^10\). The user can customize data plots by adding multiple layers of parameters (e.g. age, gender, sample type and type of genetic defects), select and modify the sample ordering and gene rank lists, and generate links (mini URL) that can be shared via e-mail or used in publications. The GXB tool enables browsing of a single transcript across multiple studies and datasets, providing new perspectives on the role of a given molecule across biological systems and PID patients. In summary, this dataset collection can aid clinicians and researchers to study and quickly visualize the functional consequences of a variety of well characterized, naturally occurring mutations on a genome-wide scale.

Methods

A total of 157 datasets were identified in GEO using the following search query: Homo sapiens AND (“primary immunodeficiency diseases” OR “primary immunodeficiencies diseases” OR PID OR “autosomal recessive” OR “autosomal dominant” OR “inherited deficiency”) AND (“Expression profiling by array”). All GEO entries that were returned with this query were manually curated. This process involved reading all the descriptions available for the datasets, the study designs and corresponding research articles. Finally, a total of 19 datasets were retained because they contained samples which were obtained from well characterized patients with known PIDs (i.e. the genetic etiology had been identified) or the samples were obtained from patients which were considered to have common variable immunodeficiency (CVID). These include datasets that were generated from whole blood, PBMCs, fibroblasts, B cells, iPS and kidney biopsy of individuals with defects in intrinsic and innate immunity, combined immunodeficiencies with associated or syndromic features, autoimmune disorders, congenital defects of phagocyte number, functions, or both, predominantly antibody deficiencies.
Table 1. List of datasets constituting the collection.

<table>
<thead>
<tr>
<th>Title</th>
<th>Platforms used</th>
<th>PID classification</th>
<th>Disease</th>
<th>Genetic defects</th>
<th>Cell type/ Tissues</th>
<th>Number of samples</th>
<th>Citation #</th>
<th>GEO ID</th>
</tr>
</thead>
<tbody>
<tr>
<td>Complete TLR3 deficiency. GSE30951.</td>
<td>Illumina HumanHT-12 v4</td>
<td>Defects in intrinsic and innate immunity</td>
<td>MyD88, TLR3, UNC93B1 deficiencies</td>
<td>Mutations of MyD88, TLR3, and UNC93B1</td>
<td>Fibroblast/ PBMC</td>
<td>44</td>
<td>17</td>
<td>GSE30951</td>
</tr>
<tr>
<td>Genome-wide profiling of whole blood from patients with defects in Toll-like receptors (TLRs) and IL-1Rs (the TIR pathway) signaling.</td>
<td>Illumina HumanHT-12 v4</td>
<td>Defects in intrinsic and innate immunity</td>
<td>IRAK4, MyD88 deficiencies</td>
<td>Mutations of IRAK4, and MyD88</td>
<td>Whole blood</td>
<td>365</td>
<td>14</td>
<td>GSE25742</td>
</tr>
<tr>
<td>Identification of IL-21-induced STAT3 dependent genes in human B cells.</td>
<td>Affymetrix HuGene 1.0 ST v1</td>
<td>Diseases of immune dysregulation</td>
<td>STAT3 GOF mutations</td>
<td>Mutations in STAT3</td>
<td>B cells</td>
<td>14</td>
<td>20</td>
<td>GSE51587</td>
</tr>
<tr>
<td>Impaired intrinsic immunity to HSV-1 in human iPSC-derived TLR3-deficient CNS cells.</td>
<td>Illumina HumanWG-6 v3</td>
<td>Defects in intrinsic and innate immunity</td>
<td>UNC93B1 deficiency</td>
<td>Mutations of UNC93B1</td>
<td>IPS</td>
<td>18</td>
<td>21</td>
<td>GSE40593</td>
</tr>
<tr>
<td>In vitro response of fibroblasts isolated from patients with immunodeficiencies.</td>
<td>Illumina Human-6 v2</td>
<td>Defects in intrinsic and innate immunity</td>
<td>Combined immunodeficiencies with associated or syndromic features</td>
<td>Mutations of UNC93B1</td>
<td>Fibroblast</td>
<td>72</td>
<td>13</td>
<td>GSE12124</td>
</tr>
<tr>
<td>In vitro response of fibroblasts isolated from patients with RBCK1 deficiency.</td>
<td>Illumina HumanHT-12 v4</td>
<td>Defects in intrinsic and innate immunity</td>
<td>Combined immunodeficiencies with associated or syndromic features</td>
<td>Mutations of MyD88, HOIL1, NEMO</td>
<td>Fibroblast</td>
<td>46</td>
<td>22</td>
<td>GSE31064</td>
</tr>
<tr>
<td>In vitro responses of fibroblasts from patients with TBK1 deficiency after TLR3 dependent and independent stimuli.</td>
<td>Illumina HumanHT-12 v4</td>
<td>Defects in intrinsic and innate immunity</td>
<td>TLR3, TBK1, STAT1 deficiencies</td>
<td>Mutations of TLR3, TBK1, and STAT1</td>
<td>Fibroblast</td>
<td>58</td>
<td>15</td>
<td>GSE38652</td>
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<tr>
<td>In vitro responses of PBMC and fibroblasts from patients with TRIF deficiency after TRIF dependent and independent stimuli.</td>
<td>Illumina HumanHT-12 v4</td>
<td>Defects in intrinsic and innate immunity</td>
<td>TLR3, TRIF and MyD88 deficiencies</td>
<td>Mutations of TLR3, TRIF, and MyD88</td>
<td>Fibroblast, PBMC</td>
<td>27</td>
<td>16</td>
<td>GSE32390</td>
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<tr>
<td>Increased Wnt and Notch signaling: A clue to the renal disease in Schimke immuno-osseous dysplasia?.</td>
<td>Affymetrix HG-U133_Plus_2</td>
<td>Combined immunodeficiencies with associated or syndromic features</td>
<td>Schimke immuno-osseous dysplasia (SOD)</td>
<td>Mutations in SMARCAL1</td>
<td>Kidney biopsy</td>
<td>5</td>
<td>23</td>
<td>GSE81156</td>
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<tr>
<td>Inherited human IRAK-1 deficiency selectively abolishes TLR signaling in fibroblasts.</td>
<td>Illumina HumanHT-12 v4</td>
<td>Defects in intrinsic and innate immunity</td>
<td>IRAK4, MyD88 deficiencies</td>
<td>Mutations of IRAK1, IRAK4, MyD88, and MECP2</td>
<td>Fibroblast</td>
<td>64</td>
<td>24</td>
<td>GSE92466</td>
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<tr>
<td>Title</td>
<td>Disease</td>
<td>PID classification</td>
<td>Platforms used</td>
<td>Cell type/ Tissues</td>
<td>Number of samples</td>
<td>Citation #</td>
<td>GEO ID</td>
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<tr>
<td>Interferon Signature in the Blood in Inflammatory Common Variable Immune Deficiency [Test Set]</td>
<td>Predominantly antibody deficiencies in common variable immune deficiency (CVID)</td>
<td>Predominantly antibody deficiencies in common variable immune deficiency (CVID)</td>
<td>Illumina HumanHT-12 v4</td>
<td>Whole blood</td>
<td>53</td>
<td>25</td>
<td>GSE5404</td>
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<tr>
<td>Interferon Signature in the Blood in Inflammatory Common Variable Immune Deficiency [Training Set]</td>
<td>Predominantly antibody deficiencies in common variable immune deficiency (CVID)</td>
<td>Predominantly antibody deficiencies in common variable immune deficiency (CVID)</td>
<td>Illumina HumanHT-12 v3</td>
<td>Whole blood</td>
<td>83</td>
<td>26</td>
<td>GSE13000</td>
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<td>IRAK-4- and MyD88-dependent pathways are essential for the removal of developing autoreactive B cells in humans</td>
<td>Defects in HLA and innate immunity</td>
<td>Defects in HLA and innate immunity</td>
<td>Affymetrix HG-U133 Plus_2</td>
<td>Whole blood</td>
<td>5</td>
<td>18</td>
<td>GSE566486</td>
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<tr>
<td>Response of IRF7-deficient peripheral blood mononuclear cells to pH1N1 influenza virus infection.</td>
<td>Congenital defects of phagocyte number, functions, or both</td>
<td>Congenital defects of phagocyte number, functions, or both</td>
<td>Illumina HumanHT-12 v4</td>
<td>Whole blood</td>
<td>18</td>
<td>27</td>
<td>GSE6282</td>
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<tr>
<td>Transcriptome analysis of whole blood in patients with a novel immunodeficiency syndrome.</td>
<td>Combined immunodeficiencies with associated or syndromic features</td>
<td>Combined immunodeficiencies with associated or syndromic features</td>
<td>Illumina HumanHT-12 v4</td>
<td>Whole blood</td>
<td>4</td>
<td>22</td>
<td>GSE40561</td>
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<tr>
<td>Transcriptome analysis in peripheral blood mononuclear cells of MOXI-I-deficient patients upon TNF-α or IL-1β stimulation.</td>
<td>Defects in HLA, -88, and NEMO deficiencies</td>
<td>Defects in HLA, -88, and NEMO deficiencies</td>
<td>Illumina HumanHT-12 v4</td>
<td>Whole blood</td>
<td>51</td>
<td>22</td>
<td>GSE4038</td>
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<tr>
<td>Transcriptome analysis in primary fibroblasts from HOIL-1-deficient patients upon TNF-α or IL-1β stimulation.</td>
<td>Combined immunodeficiencies with associated or syndromic features</td>
<td>Combined immunodeficiencies with associated or syndromic features</td>
<td>Illumina HumanHT-12 v4</td>
<td>Fibroblast</td>
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<td>22</td>
<td>GSE40360</td>
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<td>Whole Blood Transcriptional Modules generated on Illumina Hu-6 V2 Beadchips.</td>
<td>N/A</td>
<td>N/A</td>
<td>Illumina HumanWG-6 v2</td>
<td>Whole blood</td>
<td>410</td>
<td>25</td>
<td>GSE2936</td>
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</table>
Defects in intrinsic and innate immunity
Combined immunodeficiencies with associated or syndromic features
Autoinflammatory disorders
Congenital defects of phagocyte number, functions, or both
Predominantly antibody deficiencies
Diseases of immune dysregulation
N/A

Figure 1. Break down of the dataset collection by category. The pie chart indicates the PIDs classification out for the 19 datasets.

and diseases of immune dysregulation. The selected datasets are listed in Table 1. A breakdown of the dataset collection by category in accordance to the most recently published update on PID classification from International Union of Immunological Societies Expert Committee\(^5\) is shown in Figure 1.

The selected datasets were downloaded from GEO using the SOFT file format. Then, the datasets were uploaded onto our web tool, called the Gene Expression Browser (GXB), an interactive application hosted on the Amazon Web Services cloud\(^6\). Information about samples and study design were also uploaded. The available samples were assigned to groups based on the individuals and deficiencies studied and genes were ranked according to different group comparisons allowing the identification of transcripts that were differentially expressed between the patient’s and control subject’s cells cultured or stimulated \textit{ex vivo} under the same conditions. Our dataset collection, uploaded in GXB, is available at http://pid.gxbsidra.org/dm3/geneBrowser/list. A web tutorial for the use of GXB can be accessed at: https://gxb.benaroyaresearch.org/dm3/tutorials.gsp#gxbtut.

A detailed description of GXB has been recently published\(^5\) and is reproduced here so that readers can use this article as a standalone resource. Briefly, datasets of interest can be quickly identified either by filtering on criteria from pre-defined sections on the left or by entering a query term in the search box at the top of the dataset navigation page. Clicking on one of the studies listed in the dataset navigation page opens a viewer designed to provide interactive browsing and graphic representations of large-scale data in an interpretable format. This interface is designed to present ranked gene lists and display expression results graphically in a context-rich environment. Selecting a gene from the rank ordered list on the left of the data-viewing interface will display its expression values graphically in the screen’s central panel. Directly above the graphical display drop down menus give users the ability: a) To change how the gene list is ranked - this allows the user to change the method used to rank the genes, or to only include genes that are selected for specific biological interest; b) To change sample grouping (Group Set button) - in some datasets, a user can switch between groups based on cell type to groups based on disease type, for example; c) To sort individual samples within a group based on associated categorical or continuous variables (e.g. gender or age); d) To toggle between the bar chart view and a box plot view, with expression values represented as a single point for each sample. Samples are split into the same groups whether displayed as a bar chart or box plot; e) To provide a color legend for the sample groups; f) To select categorical information that is to be overlaid at the bottom of the graph - for example, the user can display gender or smoking status in this manner; g) To provide a color legend for the categorical information overlaid at the bottom of the graph; h) To download the graph as a portable network graphics (png) image. Measurements have no intrinsic utility in absence of contextual information. It is this contextual information that makes the results of a study or experiment interpretable. It is therefore important to capture, integrate and display information that will give users the ability to interpret data and gain new insights from it. We have organized this information under different tabs directly above the graphical display. The tabs can be hidden to make more room for displaying the data plots, or revealed by clicking on the blue “show info panel” button on the top right corner of the display. Information about the gene selected from the list on the left side of the display is available under the “Gene” tab. Information about the study is available under the “Study” tab. Rolling the mouse cursor over a bar chart feature while displaying the “Sample” tab lists any clinical, demographic, or laboratory information available for the selected sample. Finally, the “Downloads” tab allows advanced users to retrieve the original dataset for analysis outside this tool. It also provides all available sample annotation data for use alongside the expression data in third party analysis software. Other functionalities are provided under the “Tools” drop-down menu located in the
top right corner of the user interface. Some of the notable functionalities available through this menu include: a) Annotations, which provides access to all the ancillary information about the study, samples and dataset organized across different tabs; b) Cross-project view; which provides the ability for a given gene to browse through all available studies; c) Copy link, which generates a mini-URL encapsulating information about the display settings in use and that can be saved and shared with others (clicking on the envelope icon on the toolbar inserts the URL in an email message via the local email client); d) Chart options; which gives user the option to customize chart labels.

**Data availability**

All datasets included in our curated collection are available publicly via the NCBI GEO website: https://www.ncbi.nlm.nih.gov/gds/ and are referenced throughout the manuscript by their GEO accession numbers (e.g. GSE92466). Signal files and sample description files can also be downloaded from the GXB tool under the “downloads” tab.

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

**Acknowledgments**

We would like to thank all the investigators who decided to make their datasets publicly available by depositing them in GEO.

**References**


29. Marr AK, Boughorbel S, Presnell S, et al.: A curated transcriptome dataset collection to investigate the development and differentiation of the human placenta and its associated pathologies [version 2; referees: 2 approved].

Open Peer Review

Current Referee Status:  

Version 1

Referee Report 21 March 2019

https://doi.org/10.5256/f1000research.19737.r45968

Bertrand De Meulder
European Institute for Systems Biology & Medicine, Université de Lyon, Lyon, France

This article presents a tool to gather and make preliminary analyses on a set of curated sequencing datasets related to primary immunodeficiencies.

Regarding replication, I could not reproduce the list of datasets with the criteria that are mentioned in the text. I would have to believe that the authors are indeed reporting their results, and that the manual curation of the dataset list was accurate.

The tool that is presented has a number of issues:

- The list of datasets is rather small, and the authors do not mention whether they plan on adding datasets to the list,
- The tutorials on how to use the tools are only available to registered users, and I could not find how to register
- Graphical issues are present when displaying the charts, both in-tool and in png images.

Is the rationale for creating the dataset(s) clearly described?
Yes

Are the protocols appropriate and is the work technically sound?
Yes

Are sufficient details of methods and materials provided to allow replication by others?
Partly

Are the datasets clearly presented in a useable and accessible format?
Partly

Competing Interests: No competing interests were disclosed.

Reviewer Expertise: Bioinformatics, transcriptomics

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, however I have significant reservations, as outlined above.
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