

Mouse Genome Database (MGD) 2019

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Received October 01, 2018; Revised October 16, 2018; Editorial Decision October 17, 2018; Accepted October 30, 2018

ABSTRACT

The Mouse Genome Database (MGD; <http://www.informatics.jax.org>) is the community model organism genetic and genome resource for the laboratory mouse. MGD is the authoritative source for biological reference data sets related to mouse genes, gene functions, phenotypes, and mouse models of human disease. MGD is the primary outlet for official gene, allele and mouse strain nomenclature based on the guidelines set by the International Committee on Standardized Nomenclature for Mice. In this report we describe significant enhancements to MGD, including two new graphical user interfaces: (i) the Multiple Genome Viewer for exploring the genomes of multiple mouse strains and (ii) the Phenotype-Gene Expression matrix which was developed in collaboration with the Gene Expression Database (GXD) and allows researchers to compare gene expression and phenotype annotations for mouse genes. Other recent improvements include enhanced efficiency of our literature curation processes and the incorporation of Transcriptional Start Site (TSS) annotations from RIKEN's FANTOM 5 initiative.

INTRODUCTION

The Mouse Genome Database (MGD) is the community model organism knowledgebase for the laboratory mouse. MGD contains comprehensive information about mouse gene function, genotype-to-phenotype annotations, and mouse models of human disease (1). The mission of the MGD is to advance the use of the laboratory mouse as a model system for investigating the genetic and genomic basis of human health and disease. MGD maintains a comprehensive catalog of mouse genes and genome features connected to genomic sequence data and biological annotations. Annotations include (i) molecular function, biological process and cellular location of genes using terms and relations of the Gene Ontology (GO) (see Gene Ontology Consortium, 2), (ii) mutations, variants and human disease models using terms from the Mammalian Phenotype On-

tology (MP) and Disease Ontology (DO) and (iii) official nomenclature and identifiers for mouse gene names, symbols, alleles and strains (Table 1). The rigorous application of nomenclature and annotation standards in MGD ensures that the information in the resource is curated consistently to support robust and comprehensive data retrieval for sets of genes that share biological properties and data mining for knowledge discovery.

MGD is a core resource within the Mouse Genome Informatics (MGI) consortium (<http://www.informatics.jax.org>). Other database resources that are coordinated within the MGI consortium include the Gene Expression Database (GXD) (3), the Mouse Tumor Biology Database (MTB) (4), the Gene Ontology project (GO) (5), MouseMine (6), the International Mouse Strain Resource (IMSR) (7) and the CrePortal database of recombinase expressing mice (8). Data included in all resources hosted at the MGI website are obtained through a combination of expert curation of the biomedical literature and automated or semi-automatic processing of data sets downloaded from more than fifty other data resources. A summary of the current content of MGD is summarized in Table 2.

In this report we describe significant enhancements to MGD, including two new graphical user interfaces: (i) the Multiple Genome Viewer for exploring the genomes of multiple mouse strains and (ii) the Phenotype/Gene Expression matrix which allows users to compare gene expression and phenotype annotations for mouse genes. Other improvements include improvements to literature curation processes, and the incorporation of TSS annotations from RIKEN's FANTOM 5 initiative (9).

NEW FEATURES AND CURATION WORKFLOW ENHANCEMENTS

Multiple genome viewer

The recent release of assembled and annotated genomes for 16 inbred mouse strains (<https://www.biorxiv.org/content/early/2018/02/12/235838>) and two wild-derived strains (CAROLI/EiJ and PAHARI/EiJ) (10) represent major milestones in mouse genetics and comparative genomics. MGD's Multiple Genome Viewer (MGV; <http://www.informatics.jax.org/mgv>) was developed specifically to en-

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Table 1. Data for which MGD serves as an authoritative source

| Data type | Description |
|---|--|
| Unified mouse genome feature catalog | MGD integrates predictions from Gencode and NCBI to generate a single, comprehensive catalog |
| Gene Ontology (GO) annotations for mouse | MGD expertly curates data from literature and integrates from others |
| Mouse Phenotype annotations | MGD expertly curates data from literature and integrates from large scale projects |
| Mouse models of human disease | MGD expertly curates mouse models of human disease using terms from the Disease Ontology |
| Gene to nucleotide sequence association | MGD collaborates with NCBI and Gencode |
| Gene to protein sequence association | MGD collaborates with UniProt and Protein Ontology |
| Mammalian Phenotype (MP) Ontology | MGD develops and distributes MP |
| Symbols, names, and stable accession identifiers for genes, alleles and mouse strains | MGD implements standards set by the International Committee on Standardized Genetic Nomenclature in Mice and coordinates with human and rat gene nomenclature committees |

Table 2. Summary of MGD content September 2017–2018

| Data type | 2017 | 2018 |
|---|---------|---------|
| Genes and genome features with nucleotide sequence data | 47 693 | 49 244 |
| Genes with protein sequence data | 24 317 | 24 408 |
| Mouse genes with human orthologs | 17 089 | 17 094 |
| Mouse genes with rat orthologs | 18 509 | 18 512 |
| Genes with GO annotations | 24 502 | 24 581 |
| Total number of GO annotations | 312 109 | 316 240 |
| Mutant alleles in mice | 51 378 | 56 254 |
| Genes with mutant alleles in mice | 12 401 | 13 455 |
| QTL records | 6257 | 6605 |
| Genotypes with phenotype annotation (MP) | 60 951 | 62 551 |
| Total number of MP annotations | 315 657 | 326 292 |
| Mouse models (genotypes) associated with human diseases | 6027 | 6374 |
| References in the MGD bibliography | 237 578 | 258 926 |

able researchers to explore and compare chromosomal regions and synteny blocks between the C57BL/6J reference genome and the 18 other available mouse genomes (Figure 1). MGCV shows corresponding regions of the user-selected genomes as horizontal stripes and the equivalent features in each genome via vertical connectors (Figure 1). The navigation of the genomes is synchronized as a user scrolls in 5' or 3' directions. Researchers can generate custom sets of genes and other genome features to be displayed in MGCV by entering genome coordinates, function, phenotype, disease and/or pathway terms.

The genome feature annotations for the C57BL/6J genome displayed in MGCV are taken from MGI's Unified Mouse Genome Feature Catalog that integrates the genome feature annotations from Gencode, NCBI and miRBase into a single, non-redundant set (11). Currently, only the C57BL/6J assembly and annotations are 'reference quality', thus there are some gaps in the annotations which limit the ability of a user to identify equivalent genome features across all of the available genomes. As additional sequence data are generated, improvements will be made to the quality of all the assemblies and their corresponding genome feature predictions.

Gene model structure details and sequences for all 19 annotated mouse genomes are also accessible from MGI's MouseMine (<http://www.mousemine.org>) through its user interface and web services (MouseMine web services back the Multiple Genome Viewer). Using MouseMine, researchers may search for genes in specific strains and retrieve relevant data including transcripts, exons in a GFF file, and CDSs in FASTA format. On a MouseMine gene

page—or when viewing a list of genes—several new query templates are automatically run and provide easy navigation and retrieval of the structural components of gene models (e.g. exons, introns) across user-selected strains. These new templates provide access from a gene to its strain-specific genomic sequences, transcripts, CDSs, or exons. An Export button, located above a report, will allow a user to download results in several formats: tab or comma-separated file, FASTA or GFF3.

Phenotype/Gene expression comparison matrix

In collaboration with the Gene Expression Database (GXD), we deployed a new interface that allow users to compare gene expression and phenotype data for a given gene (see also Smith CM *et al.*, 12). The new Phenotype/Gene Expression Comparison Matrix, accessible from the Expression and Mutations, Alleles and Phenotype section of MGD's gene detail pages, visually juxtaposes information about tissues where a gene is normally expressed against tissues where mutations in that gene cause abnormal phenotypes (Figure 2). Using this new data display tool researchers may explore the molecular mechanisms of disease by answering such questions as 'What tissues affected by a gene mutation also show expression of that gene?' or 'What tissues affected by a gene mutation do not express that gene?'

Literature triage process improvements

While the numbers of publications indexed in PubMed that mention mice continues to grow (~72 000 papers added in

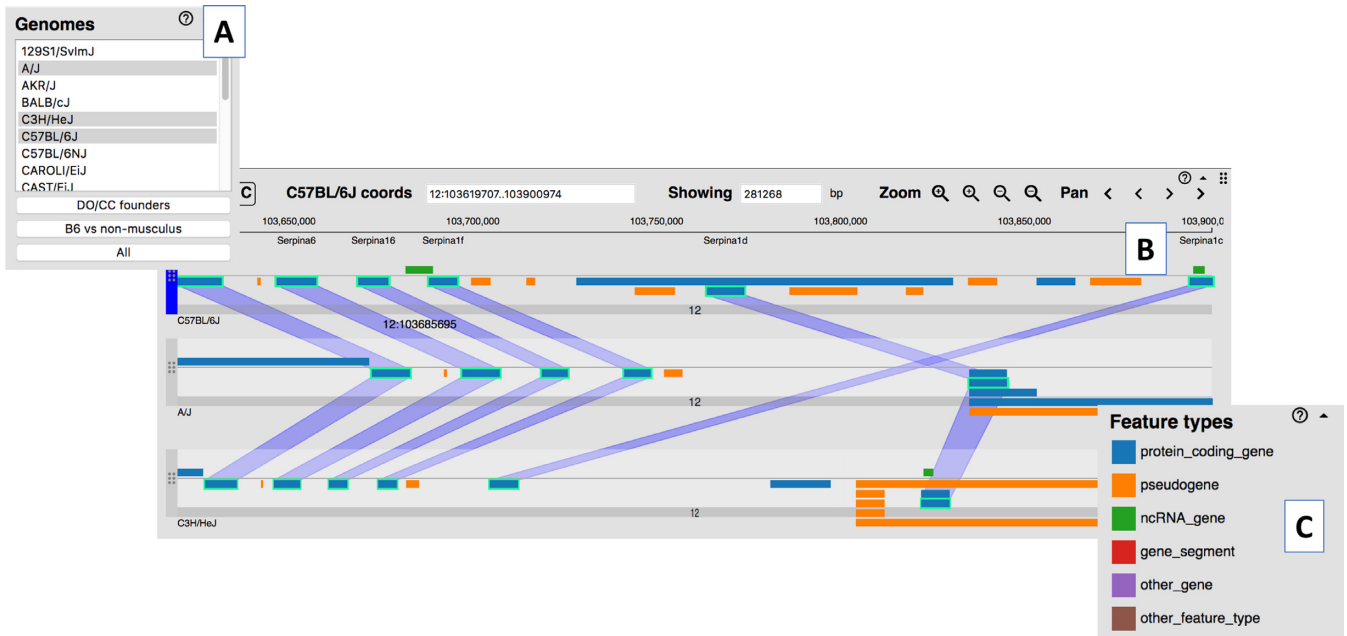


Figure 1. A screenshot of MGD's Multiple Genome Viewer showing the display of genome annotations across multiple strains of mice. (A) Users may select one or more genomes to be displayed. (B) Equivalent genome features across the strains are highlighted by 'swim lanes' when a user clicks on one or more genome features. (C) Genome feature types (protein coding gene, pseudogene, etc.) are indicated by color; classes of genome features can be toggled on and off in the display.

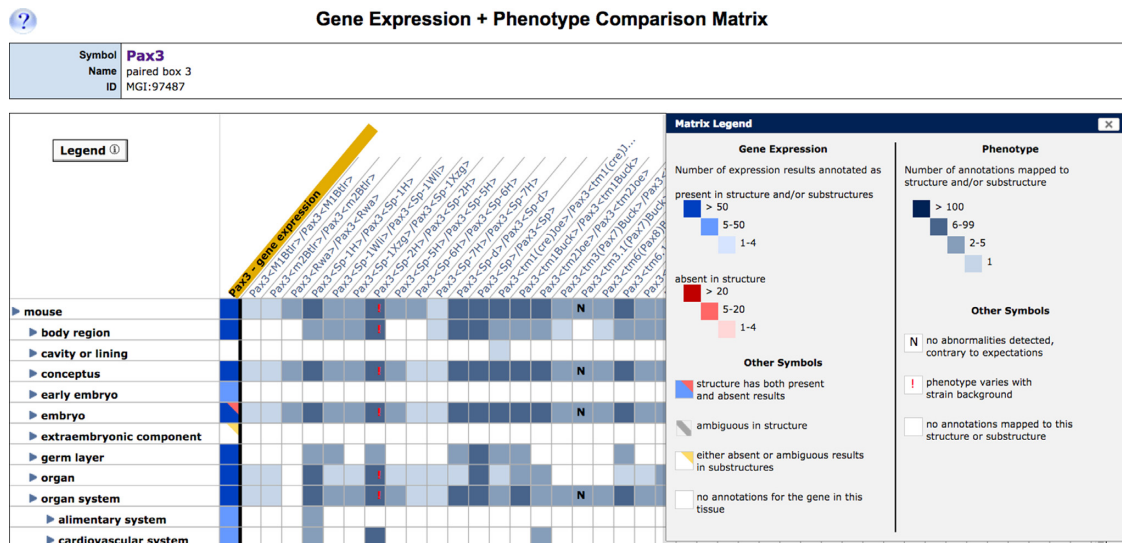


Figure 2. Screenshot of the Gene Expression-Phenotype Matrix. The first column (gold highlight) summarizes the wild-type expression pattern of the Pax3 gene. The color of matrix cells in the column indicates the type and number of expression annotations for each tissue; the conventions are defined in the matrix legend (inset). Genotype summary data associated with alleles of Pax3 are displayed in the adjacent columns. The tissues where each mutation/genotype has phenotypic effects are indicated by the presence of colored matrix cells. Cells with an 'N' indicate that an expected abnormality was not detected. A red exclamation point indicates the phenotype is affected by changes in mouse strain background. Clicking on blue toggles next to term names expands and collapses the anatomy vocabulary tree. Annotation details are displayed when users click in the cells of the matrix.

2017), the subset of papers relevant to MGD (i.e. those focused on genetics and genomics of the laboratory mouse) has remained relatively stable. We curate ~12 000 of these papers each year, primarily from a core set of 160 journals. A major challenge for MGD curators is how to identify the relevant subset of papers from a large corpus of biomedical literature. Manuscripts, while peer-reviewed, are often published without annotations using relevant bio-ontologies;

authors often do not adhere to existing gene, allele or mouse strain nomenclature standards for example. As a consequence, the identification of publications that are actually relevant to MGD's mission requires a substantial investment of time for manual review.

To improve the scalability of our literature curation efforts, we have streamlined our literature selection processes and implemented software infrastructure to support au-

tomation for these processes. We now store the full text of papers extracted from PDFs downloaded from publishers and assess the relevance of papers using keyword searches. Downloading papers from PLoS journals is performed automatically and takes advantage of the PLoS API's full text search capabilities. Full text searches improve the identification of relevant papers for MGD because important keywords such as mouse and murine are often not mentioned in article titles and abstracts. In the eleven months following the implementation of the improved literature selection processes (aka, literature triage), individual curator efficiency in identifying papers relevant to mouse phenotypic alleles has increased by 83% as measured by number of relevant papers identified by an individual per unit time. For our user communities, the increased efficiency in literature curation means a shorter time between publication and accessibility of the phenotype and disease annotations from MGD.

To build training sets that can be used for future automatic efforts and to support research in natural language processing and machine learning, we also now store full text of papers that are deemed not relevant to MGD in addition to the relevant papers.

Transcriptional Start Site (TSS) genome features

As part of MGD's efforts to represent experimentally supported regulatory regions in the mouse genome, over 164 000 Transcriptional Start Sites (TSS) identified by investigators at the RIKEN Institute using Cap Analysis Gene Expression (CAGE) sequencing (9) were loaded into MGD. TSS sites are particularly informative for delineating the structure of promoter regions of genes; many genes have more than one promoter region that controls the expression of alternative transcript forms. Over 22 000 of the TSS sites identified by the RIKEN data are associated with annotated mouse genes. From a gene detail page, users can see the annotated TSS sorted by distance from the gene's 5' end.

The RIKEN TSS data are also available as 1015 tracks in MGD's JBrowse-based mouse genome sequence browser (<http://jbrowse.informatics.jax.org/>). The tracks implemented in JBrowse include TSSs obtained from sequencing primary cells (140 tracks), tissues (23 tracks), developmental stages (257 tracks), and time course experiments (591 tracks).

IMPLEMENTATION AND PUBLIC ACCESS

The production database for MGD is a highly normalized relational database hosted on a PostgreSQL server behind a firewall. The production database is designed and optimized for data integration and incremental updating and is not directly accessible by the public. The public web interface is backed by a combination of a highly denormalized databases (also in PostgreSQL) and Solr/Lucene indexes, designed for high performance query and display in a read-only environment. The front-end data stores are refreshed from the production database once a week. The separation of public and production architectures provides a large measure of flexibility in project planning, as either side can (and often does) change without affecting the other.

MGD broadcasts data in a variety of ways to support basic research communities, clinical researchers and advanced

users interested in programmatic or bulk access. MGD provides free public web access to data from <http://www.informatics.jax.org>. The web interface provides a simple 'Quick Search', available from all web pages in the system and is the most used entry point for users. The Quick Search may be used to search for genes and genome features, alleles and ontology or vocabulary terms. Multi-parameter query forms for a number of data types are provided to support searches based on specific user-driven constraints, Genes and Markers; Phenotypes, Alleles and Diseases; SNPs; and References. Data may be retrieved from most results pages by downloading text or Excel files, or forwarding results to Batch Query or MouseMine analysis tools (see below).

MGD offers batch querying interfaces for data retrieval for users wishing to retrieve data in bulk. The Batch Query tool (<http://www.informatics.jax.org/batch>) (13) is used for retrieving bulk data about lists of genome features. Feature identifiers can be typed in or uploaded from a file. Gene IDs from MGI, NCBI GENE, Ensembl, UniProt and other resources can be used. Users can choose the information set they wish to retrieve, such as genome location GO annotations, list of mutant alleles, MP annotations, RefSNP IDs and Disease Ontology (DO) terms. Results are returned as a web display or in tab delimited text or Excel format. Results may also be forwarded to MouseMine (see below).

MGD data access is available through MouseMine (<http://www.mousemine.org>), an instance of InterMine that offers flexible querying, templates, iterative querying of results and linking to other model organism InterMine instances. MouseMine access is also available via a RESTful API, with client libraries in Perl, Python, Ruby, Java and JavaScript. MouseMine contains many data sets from MGD, including genes and genome features, alleles, strains and annotations to GO, MP and DO.

MGD provides a large set of regularly updated database reports from <http://www.informatics.jax.org/downloads/>. Direct SQL access to a read-only copy of the database is also offered. Those interested in SQL access should contact MGI user support for an account. MGI User Support is also available to assist users in generating customized reports on request.

Interactive graphical interfaces for browsing mouse genome annotations is supported through our instance of JBrowse (<http://jbrowse.informatics.jax.org/>), a JavaScript-based interactive genome browser with multiple features for navigation and track selection (14).

MGD is one of the founding members of the Alliance of Genome Resources, a new data resource integration effort among the major model organism (MOD) database groups and the Gene Ontology Consortium (GOC). The other founding members of the Alliance are FlyBase, WormBase, Saccharomyces Genome Database (SGD), Rat Genome Database (RGD) and the Zebrafish Information Network (ZFIN). The Alliance is standardizing access to common data types from different model organisms to better support comparative biology investigations for biomedical researchers (15). Genetic and genomic data for the laboratory mouse that are curated by MGD are available from the public web portal for the Alliance (<http://www.alliancegenome.org>). Data types accessible from the Alliance web site currently include gene names and symbols, genome locations,

orthology, function annotations, and disease associations. New data types (e.g. gene expression, interactions, etc.) are being added to the site regularly. The Alliance serves as one of the designated Data Stewards for the NIH Data Commons Pilot Project, providing access to model organism data and annotations via APIs to promote the development of the next generation of cloud-based data access and analysis platforms in genome biology.

FUTURE DIRECTIONS

In addition to continuing the essential core functions of MGD, three major enhancements are planned for this resource over the next year. First, following the decision of NCBI's dbSNP to no longer include variation data from model organisms, MGD will implement data loads for mouse SNP data from the European Variation Archive (EVA; <https://www.ebi.ac.uk/eva/>). Second, we will implement new user interfaces focused on delivering diverse data about individual mouse strains. Although we have provided a strain accession ID service and descriptions of strain characteristics from the classic Festing's inbred strain lists resource for many years (http://www.informatics.jax.org/inbred_strains/mouse/STRAINS.shtml), the new strain detail pages will provide access to detailed information about strain-specific mutations, phenotype and disease model information, published references, and links to multiple external resources such as Mouse Phenome Database (MPD) (16), the International Mouse Strain Resource (IMSR) (7) and MGD's new Multiple Genome Viewer. Third, the Multiple Genome Viewer will be extended to support display of the intron/exon structure of protein coding genes to allow the comparison of gene structure across strains.

OUTREACH

User Support staff are available for on-site help and training on the use of MGD and other MGI data resources. MGD provides off-site workshop/tutorial programs (roadshows) that include lectures, demos and hands-on tutorials and can be customized to the research interests of the audience. To inquire about hosting an MGD roadshow, email mgi-help@jax.org. On-line training materials for MGD and other MGI data resources are available as FAQs and on-demand help documents.

Members of the User Support team can be contacted via email, web requests, phone or fax.

- World wide web: http://www.informatics.jax.org/mgihome/support/mgi_inbox.shtml
- Facebook: <https://www.facebook.com/mgi.informatics>
- Twitter: <https://twitter.com/mgi> mouse and https://twitter.com/hmdc_mgi
- Email access: mgi-help@jax.org
- Telephone access: +1 207 288 6445
- Fax access: +1 207 288 6830

MGI-LIST (<http://www.informatics.jax.org/mgihome/lists/lists.shtml>) is a forum for topics in mouse genetics and MGI news updates. It is a moderated and active email-based bulletin board for the scientific community

supported by the MGD User Support group. MGI-LIST has over 1800 subscribers. A second list service, MGI-TECHNICAL-LIST, is a forum for technical information about accessing MGI data for software developers and bioinformaticians, for using the APIs and for making web links to MGI pages.

CITING MGD

For a general citation of the MGI resource, researchers should cite this article. In addition, the following citation format is suggested when referring to datasets specific to the MGD component of MGI: mouse genome database (MGD), MGI, The Jackson Laboratory, Bar Harbor, Maine (URL: <http://www.informatics.jax.org>). Type in date (month, year) when you retrieved the data cited.

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ACKNOWLEDGEMENTS

The authors thank David Shaw and Meiyee Law for their leadership in providing User Support to the community of scientists who use all MGI data resources.

FUNDING

National Institutes of Health/National Human Genome Research Institute [U41 HG000330, R25 HG007053, U41 HG002223]. Funding for open access charge: NIH/NHGRI [U41 HG000330].

Conflict of interest statement. None declared.

REFERENCES

1. Smith,C.L., Blake,J.A., Kadin,J.A., Richardson,J.E., Bult,C.J. and Mouse Genome Database, G. (2018) Mouse Genome Database (MGD)-2018: knowledgebase for the laboratory mouse. *Nucleic Acids Res.*, **46**, D836–D842.
2. The Gene Ontology Consortium (2018) The Gene Ontology Resource: 20 years and still GOing. *Nucleic Acids Res.*, doi:10.1093/nar/gky1055.
3. Finger,J.H., Smith,C.M., Hayamizu,T.F., McCright,I.J., Xu,J., Law,M., Shaw,D.R., Baldarelli,R.M., Beal,J.S., Blodgett,O. *et al.* (2017) The mouse Gene Expression Database (GXD): 2017 update. *Nucleic Acids Res.*, **45**, D730–D736.
4. Krupke,D.M., Begley,D.A., Sundberg,J.P., Richardson,J.E., Neuhauser,S.B. and Bult,C.J. (2017) The Mouse Tumor Biology Database: a comprehensive resource for mouse models of human cancer. *Cancer Res.*, **77**, e67–e70.
5. The Gene Ontology, C. (2017) Expansion of the Gene Ontology knowledgebase and resources. *Nucleic Acids Res.*, **45**, D331–D338.
6. Motenko,H., Neuhauser,S.B., O'Keefe,M. and Richardson,J.E. (2015) MouseMine: a new data warehouse for MGI. *Mamm. Genome.*, **26**, 325–330.

7. Eppig,J.T., Motenko,H., Richardson,J.E., Richards-Smith,B. and Smith,C.L. (2015) The International Mouse Strain Resource (IMSR): cataloging worldwide mouse and ES cell line resources. *Mamm. Genome.*, **26**, 448–455.
8. Heffner,C.S., Herbert Pratt,C., Babiuk,R.P., Sharma,Y., Rockwood,S.F., Donahue,L.R., Eppig,J.T. and Murray,S.A. (2012) Supporting conditional mouse mutagenesis with a comprehensive cre characterization resource. *Nat. Commun.*, **3**, 1218.
9. Fantom-Consortium, Forrest,A.R., Kawaji,H., Rehli,M., Baillie,J.K., de Hoon,M.J., Haberle,V., Lassman,T., Kulakovskiy,I.V., Lizio,M. *et al.* (2014) A promoter-level mammalian expression atlas. *Nature*, **507**, 462–470.
10. Thybert,D., Roller,M., Navarro,F.C.P., Fiddes,I., Streeter,I., Feig,C., Martin-Galvez,D., Kolmogorov,M., Janousek,V., Akanni,W. *et al.* (2018) Repeat associated mechanisms of genome evolution and function revealed by the *Mus caroli* and *Mus pahari* genomes. *Genome Res.*, **28**, 448–459.
11. Zhu,Y., Richardson,J.E., Hale,P., Baldarelli,R.M., Reed,D.J., Recla,J.M., Sinclair,R., Reddy,T.B. and Bult,C.J. (2015) A unified gene catalog for the laboratory mouse reference genome. *Mamm. Genome.*, **26**, 295–304.
12. Smith,C.M., Hayamizu,T.F., Finger,J.H., Bello,S.M., McCright,I.J., Xu,J., Baldarelli,R.M., Beal,J.S., Campbell,J., Corbani,L.E. *et al.* (2018) The mouse Gene Expression Database (GXD): 2019 update. *Nucleic Acids Res.*, doi:10.1093/nar/gky922.
13. Eppig,J.T., Blake,J.A., Bult,C.J., Kadin,J.A., Richardson,J.E. and Mouse Genome Database, G. (2015) The Mouse Genome Database (MGD): facilitating mouse as a model for human biology and disease. *Nucleic Acids Res.*, **43**, D726–D736.
14. Skinner,M.E., Uzilov,A.V., Stein,L.D., Mungall,C.J. and Holmes,I.H. (2009) JBrowse: a next-generation genome browser. *Genome Res.*, **19**, 1630–1638.
15. Howe,D.G., Blake,J.A., Bradford,Y.M., Bult,C.J., Calvi,B.R., Engel,S.R., Kadin,J.A., Kaufman,T.C., Kishore,R., Laulederkind,S.J.F. *et al.* (2018) Model organism data evolving in support of translational medicine. *Lab. Anim. (NY)*, **47**, 277–289.
16. Bogue,M.A., Grubb,S.C., Walton,D.O., Philip,V.M., Kolishovski,G., Stearns,T., Dunn,M.H., Skelly,D.A., Kadakkuzha,B., TeHennepe,G. *et al.* (2018) Mouse Phenome Database: an integrative database and analysis suite for curated empirical phenotype data from laboratory mice. *Nucleic Acids Res.*, **46**, D843–D850.