

*Ratpost***: a searchable database of protein‑inactivating sequence variations in 40 sequenced rat‑inbred strains**

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Abstract

Rat-inbred strains are essential as scientifc tools. We have analyzed the publicly available genome sequences of 40 rat-inbred strains and provide an overview of sequence variations leading to amino acid changes in protein-coding genes, premature STOP codons or loss of STOP codons, and short in-frame insertions and deletions of all protein-coding genes across all these inbred lines. We provide an overview of the predicted impact on protein function of all these afected proteins in the database, by comparing their sequence with the sequences of the rat reference strain BN/SsNHsdMcwi. We also investigate the faws of the protein-coding sequences of this reference strain itself, by comparing them with a consensus genome. These data can be retrieved via a searchable website (Ratpost.be) and allow a global, better interpretation of genetic background efects and a source of naturally defective alleles in these 40 sequenced classical and high-priority rat-inbred strains.

Introduction

The use of the rat (NCBI Taxon ID 10116, *Rattus norvegicus*), as a model organism in research has a long history and started in the nineteenth century. The rat is considered to be the frst organism to have been domesticated for scientifc research purposes (Modlinska and Pisula [2020;](#page-10-0) Richter [1959\)](#page-10-1). While some sporadic experiments using rats were done in the frst part of the nineteenth century, such as an experiment on fasting in 1829 (Hedrich [2000](#page-10-2); Modlinska and Pisula [2020](#page-10-0)), the systematic use of rats has started in 1856 (Philipeaux [1856](#page-10-3)), with studies on the impact of adrenalectomy (Philipeaux [1856](#page-10-3)) followed by studies on nutrition (Savory [1863\)](#page-10-4), behavior, neurology, and others (Bergman et al. [2000;](#page-9-0) Watson [1914](#page-10-5); Jonckers et al. [2011](#page-10-6); Logan [1999\)](#page-10-7). In some felds, rats outperform mice, mainly because of their bigger size, allowing larger biopsies and

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more repetitive (blood) samples to be taken, higher resolution imaging (e.g., in cancer therapy Bergman et al. [2000\)](#page-9-0) and better precision in surgery (Jonckers et al. [2011](#page-10-6); Modlinska and Pisula [2020\)](#page-10-0). In cardiovascular research and neurobiology, rats are often preferred above mice, based on size and the amount of already available datasets and papers (Ellenbroek and Youn [2016](#page-9-1); Leong et al. [2015](#page-10-8)). On the other hand, rat research is more expensive than mouse work, as rats require larger cages and more space. Like in the mouse feld, rat research is mostly performed in rat-inbred strains, but outbred lines, typically yielding individuals with less defned genetic background, are also used (Sharp and Villano [2013](#page-10-9)).

The laboratory rat is the second most used animal model organism of all species; for example, in the European union rats accounted for 12.2% of all animals used in 2017, preceded only by the mouse (60.8%). This popularity was one of the reasons why the rat was selected to have its genome sequenced with priority, which was possible via a whole genome shotgun sequencing approach. The frst draft of the rat reference genome was published in 2004 by the rat genome sequencing consortium (Gibbs et al. [2004\)](#page-9-2). This genome was derived from the inbred Brown Norway strain (BN/SsNHsd), which was selected by the community and inbred another 13 generations at Medical College of Wisconsin (to BN/SsNHsdMcwi) before sequencing 2 females of this strain (Gibbs et al. [2004](#page-9-2)).

However, several rat strains/stocks were specifcally bred to yield and investigate specifc phenotypes or diseases. For inbred lines, well-known examples are the spontaneously hypertensive rat (SHR) strains that develop spontaneous hypertension (Conrad et al. [1995\)](#page-9-3) or the Zucker Rat strain develops obesity (Obrosova et al. [2006](#page-10-10)). In outbred stocks, the outbred heterogeneous stock rat is one of the best known, created from 8 founder lines and used to study complex traits (Woods and Mott [2017](#page-10-11)) (e.g., depression disorder (Holl et al. [2018](#page-10-12))). It is thus important that genetic variation between the strains is investigated in order to help explain the genetic components underlying these and other phenotypes. The sequencing of 28 rat (sub)strains by Atanur et al. [\(2013](#page-9-4)) and the sequencing of 40 strains (including resequencing and/ or reanalysis of the previous 28) by Hermsen et al. [\(2015\)](#page-10-13) encompass all the data that are currently available. These can be accessed at the rat genome database (RGD, Smith et al. [2020\)](#page-10-14), where also additional information can be found concerning gene ontologies, QTLs, phenotypes, variants, pathways, as well as various tools to use this information (e.g., ontology enrichment, pathway browser).

While the rat sequence variations data are available in the RGD database, the data are provided to the user in a variant browser or as compressed vcf fles. The information provided for coding genes is limited in the sense that only the nucleotide variation and the efect on the coding sequence (missense, nonsense) is given while there is no detailed overview over the consequences of the amino acid variation on the protein function, or a way to see the combined efect on the fnal amino acid sequence at a given position in a certain strain, compared to the reference strain amino acid. The latter can be important, as multiple mutations may afect a single codon, it was even shown that many of the nonsense variants actually have a second SNP that leaves a missense instead of a nonsense variant (Hermsen et al. [2015](#page-10-13)). However, the RGD does provide information about non-coding variants, where our tool provides only details about protein-coding variants. This makes the RGD a highly complementary resource to the tool described in this work.

Since a single amino acid change can have impact on protein function, ranging from no impact to a mild change or ruining the proteins function entirely, the coupling of amino acid variations to predicted function changes is essential. We have addressed this problem in the past, studying all amino acid changes in all 42 sequenced mouse inbred strains, and combined this information in a user-friendly database, called 'mousepost' (Timmermans et al. [2017](#page-10-15)). In the current study, we have focused our attention on the analysis of protein-coding variants in the 40 sequenced rat stains, as compared to the reference strain BN/SsNHsdMcwi. We have focused on high-confdence homozygous variants in inbred strains and report those contributing to changes in amino acid sequence, viewed on a per codon basis. Note that several of these are derived from outbred stocks such as the WKY/N strain from Wistar rats [https://rgd.mcw.edu/.](https://rgd.mcw.edu/) Our data allow thus to link phenotypes of rat strains with amino acid polymorphisms, as well as studying all variant versions of a given protein across all sequenced rat strains, or a genome-wide strain-to-strain comparison. Finally, we have also focused on the potential defects in protein-coding genes in the reference strain BN/ SsNHsdMcwi, by comparing its genome to a consensus genome, defned by the other 40 sequenced strains.

Results and discussion

Classifcation of variants and comparison with the reference rat genome

The first draft assembly of the rat (*Rattus norvegicus*) genome was released in 2004 (Gibbs et al. [2004](#page-9-2)) and has been improved since. The reference genome is derived from the BN/SsNHsdMcwi inbred rat strain. The genome of 40 other high-priority rat-inbred strains has also been sequenced (Hermsen et al. [2015\)](#page-10-13). The rat genome browser (RGD, <https://rgd.mcw.edu/>) is a rich database which contains the reference rat genome sequence, rat phenotype information, protein–protein interaction data, nucleotide variants, from more than 100 frequently used rat-inbred strains, and outbred stocks. Most of the research of today is preferentially performed in inbred lines, because of the stability in time and space of an inbred genome, and the identical background of individual animals within a certain inbred strain. Outbred animals are often used for more general research and behavioral studies. The identifcation of protein-coding variations among the rat strains is important for the correct interpretation of research or may serve as a useful tool for genetic research.

Since even a single nucleotide sequence polymorphism (SNP) variation in a protein-coding gene can have a severe efect on the protein function, via an amino acid change or the formation of a nonsense mutation STOP signal, we decided to transform the tabular lists of SNPs, and their positions in the rat genome, in protein-coding genes, into amino acids changes in the corresponding proteins, for each protein across all 40 sequenced rat strains, with the reference genome as a standard.

Sequence variations of a given rat-inbred strain compared to the reference strain are found in 'variant fles' in the RGD. As a frst step, we processed the variants fles to retain only high-quality events. For each strain, coding genes and SNP/ indel events were fltered as to only retain relevant genes (containing at least one nucleotide variant in that strain) and events overlapping with exons. Transcripts were classifed exclusively in one of three classes: (1) stop gained (SG), which are sequence variations leading to a new STOP codon (missense mutation), (2) stop lost (SL), which are nucleotide changes leading to a loss of a STOP codon and further translation of the mRNA and (3) non-synonymous variants (MUT), which are small insertions and deletions of maximally 200 bp and SNPs, as shown in Fig. [1.](#page-2-0) For each class, transcripts and all accompanying data and results are stored in a relational database for use in the web tool. An SG or SL variant takes precedence over the MUT class, so a gene containing an SG and any number of MUT events will have the label SG. These data also include splice variants, but only in the case of a mutation in the canonical splice donor or splice acceptor sites. Such sites are not specially annotated and are then seen as either intron retention or exon loss, and the variant CDS is constructed with these variations included. The final effect is most likely a frameshift and nonsense mutation, and these are included in the corresponding class (usually SG).

The impact of SG or SL variants was estimated by the length ratio, i.e., we assumed that the greater the deviation from the reference protein chain length, the more likely that there will be an impact on function. In general, a nonsense variant removes 46.6% of the total sequence (median value,

Fig. 1 Data use fowchart: data are obtained from ensemble (genome annotations) and the rat genome database (reference genome, sequence variants). Protein-coding transcripts are fltered from the genome annotation and their exon sequences extracted from the genome. Only transcripts with at least one exon containing a variant are kept. Variants are likewise fltered so only those overlapping an exon are kept. We perform three analyses: First, we compare the strainspecifc sequences of each individual strain to the reference sequence. Second, we construct a synthetic consensus reference from all strain-specifc sequences using a majority vote method (per position), and the reference sequence is compared to this consensus in order to obtain genes that can be considered to be deviant in the reference strain. For these two analyses, protein sequences are classifed as stop gain, stop loss, or mutated (non-synonymous variant(s)). Potential effects of mutated variants are estimated with PROVEAN. Finally, we perform a pairwise comparison between each of the nonreference strains to obtain a list of all diferences. All these data are made available in the website "ratpost.be" and can be accessed through strain and class-specifc listing or searched by gene, location, or gene ontology term

mean: 47.2%), resulting in a high impact. For MUT variants, we applied the Protein Variant Efect Analyzer (PROVEAN) software to provide a score to a given variation (Choi et al. [2012\)](#page-9-5). We are aware that the SL- and SG-classifed transcripts may contain additional non-synonymous variants, but these were not analyzed further with PROVEAN. We made this decision by taking into consideration the additional information gained by performing a PROVEAN analysis compared to the time and the computational resources needed to obtain these scores. The variant sequences themselves are available in the web tool. The PROVEAN score indicates the chance that the variant amino acid will afect the protein function. The lower the score, the higher the chance of function loss. Based on previous papers from the authors of the PROVEAN software (Choi and Chan [2015a](#page-9-6); Choi et al. [2012\)](#page-9-5), we here considered PROVEAN scores lower than − 2.5 as leading to signifcant function loss. This is the point where the software shows the optimal balanced accuracy, i.e., where the sensitivity and specifcity are both within acceptable limits. For PROVEAN, this means a sensitivity and specificity of about 80%. A higher specificity (90%) can be obtained by changing the score cut-off (-4.1) at the cost of the sensitivity, which drops to 57%. We tested all 32,883 genes included in the ensemble genome annotation for the rat reference genome (41,078 transcripts). Our analysis showed that 12,172 distinct transcripts from 9715 genes have at least one natural variant in the included rat strains, which corresponds to 29.6% of the transcriptome or 29.5% of all genes. The total amount of diferent variants per strain and per class is shown in Table [1.](#page-4-0) As expected, the amount of non-synonymous variants (MUT) is the largest group. However, only a fraction of those (28.7%) are predicted to be potentially deleterious for protein function (PROVEAN score $<- 2.5$). The amount of nonsense (SG) variants in each strain compared to the reference strain is lower compared to the missense variants, with a maximum of 627 transcripts afected in any one strain (median: 558, IQR: 160). The amount of transcripts afected by a variant removing the stop codon is lower, with 67 or less transcripts afected per strain (median: 45, IQR: 1). While the number of non-synonymous variants is the highest, only 20–30% of those have a PROVEAN score of − 2.5 or lower, so the majority of them predicted not to infuence protein function. The other BN strains ("BN/SsN", "BN-Lx/ Cub", "BN-Lx/CubPrin"), which are closest related to the reference strain, display the lowest number of variants, as expected. In absolute numbers, the non-BN strains are all in the same range for amount of variant-containing transcripts (median(IQR): 599(43), 55(7), and 4971(518) for SG, SL, and MUT, respectively). In the 3 BN strains, the proportion of SG variants on the total is much higher than in the other non-BN strains. With an average of 278 transcripts that contain a stop-gain variants in the "BN/SsN", "BN-Lx/Cub",

"BN-Lx/CubPrin" strains, 45.5% of all variant-containing transcripts in these strains fall in the SG category. For the non-BN strains, there are on average 532 stop-gain containing transcripts per strain, amounting to 9.5% of all variantcontaining transcripts in each strain, on average. Many of the sequenced strains are also related closely to one another or are derived from a common stock; for example, the SHR strains. Compared to the reference strain, these have similar amounts of variants and many of these are shared between several or all these strains. In case of the SHR strains, 64% of all events (2035 of 3329) are shared between at least two and 23% between all of them (764 of 3329), as is illustrated in Fig. [2.](#page-5-0) Note that one of the SHR strains, SHR/OlaIpcvPrin has a larger amount of strain-specifc variants (914) than the other three (43, 98, 139).

Data availability

All data displayed in Table [1](#page-4-0) are available through the searchable *Ratpost* (*rat po*lymorphic *s*equence tags) web tool, which is available at ratpost.be. The database provides an overview table showing the number of SG, SL, and MUT variants per strain, with customizable cut-ofs for length ratios and PROVEAN scores, and the numbers in the table are clickable. A listing of the strain-specifc variants (versus the reference strain), divided by type, can also be obtained and exported in combination with various advanced flter options.

Ratpost provides several search functions that may assist with various questions. For example, (1) the tool provides the option to search for all variants of a particular proteincoding gene or transcript, across all 40 strains, or in a subset of these strains; (2) a search for variants, based on chromosomal location, can be helpful in the process of mapping and positional cloning of a trait; and (3) searching deviant protein-associated functions (by introducing a gene ontology term) is also possible. As a way of providing examples, which illustrate the power of the tool, we investigated several variants that are potentially interesting and/or relate to known (strain-specifc) rat phenotypes. We provide three examples.

One of the best known variants in several mammalian species is the loss of function of tyrosinase (*Tyr*), resulting in an albino phenotype (Blaszczyk et al. [2005](#page-9-7)). In *Ratpost*, by introducing 'Tyr' as a search function, we recovered the previously identifed *Tyr* variant (Blaszczyk et al. [2005](#page-9-7)) with a loss-of-function efect, the R299H mutation, which has a PROVEAN score of − 3.2 and is found in 32 strains. This is due to the fact that many strains that were sequenced are albino strains having the defect Tyr gene.

The Wistar outbred stock is well known as a model for diabetes since these rats develop diabetes spontaneously (Obrosova et al. [2006\)](#page-10-10). Four inbred strains derived from

Table 1 Number of genes and

transcripts per class

For 'MUT' the total number and the number with PROVEAN score<− 2.5 are shown

Wistar rats have been sequenced (WKY/N, WKY/Nctrl, WKY/NHsd, WKY/Gla). Searching for genetic variants in genes related to diabetes (by entering the GO term 'glucose metabolic process') provides *Gckr* (glucokinase regulator) with the variant R149C (PROVEAN score − 4.9) found in three out of four strains (WKY/N, WKY/Nctrl, WKY/NHsd) as a likely polymorphism related to the diabetes phenotype. It has been shown that both a genetic and an environmental component are involved in developing the disease (Liu et al. [2015](#page-10-16); Stumvoll et al. [2005](#page-10-17)), and this gene may contribute to

the former. The gene itself is a strong candidate for maturity onset diabetes of the young in humans (O'Leary et al. [2016\)](#page-10-18). Another hit in this analysis is *Phip*, which has the GO function 'insulin receptor binding' (GO) and is involved in promotion of development and survival of pancreatic β cells (Podcheko et al. [2007\)](#page-10-19). The encoded protein has a W388L variant, (with a PROVIAN score of -10.7) found in the GK/ Ox strain, a standard rat model for rat type 2 diabetes (Liu et al. [2015](#page-10-16); Stumvoll et al. [2005\)](#page-10-17).

The SHR strains develop spontaneous and severe hypertension (Conrad et al. [1995](#page-9-3)). This phenotype was linked to several genomic loci. When interrogating *Ratpost*, we found a few dozen genes at these locations with predicted deleterious variants present in these strains, and so we were not able to clearly identify a major candidate gene (Smith et al. [2020\)](#page-10-14), but interestingly, we found that these strains also have a mutation in the gene *Mybphl* (W159L, PROVEAN of − 12.7). The protein (Myosine-binding protein H-like) plays a role in cardiac function (Barefeld et al. [2017](#page-9-8)) and may sensitize these rats for developing the cardiac issues (heart failure) that they are known to develop as a result of their the hypertension (Trippodo and Frohlich [1981\)](#page-10-20).

As a fnal example of the value of the database, in Supplemental Table, we provide the results of a search with the GO term "infammation," which yield a variety of interesting deviant alleles present in several rat-inbred strains, e.g., in the genes *Tlr3*, *Tlr10*, *Tlr12,* or the Mineralocorticoid gene *Nr3c2*.

Variations in the reference and pairwise comparisons

As shown in Supplemental Figure, most variants are specifc to only one strain, or to a rather small group of strains.

However, it is clear that there are also some variants that are found in many strains, resulting in a situation where the *alternative* sequence is the one that occurs in the majority of strains that have been sequenced. This means that there are also genes where the reference strain is the one containing the *variant* or *defective* gene: similarly as the mouse reference strain C57BL/6J has been shown to harbor multiple variant (even defective) protein-coding genes compared to all other strains (Timmermans and Libert [2018\)](#page-10-21), we categorized genes where the reference strain, BN/SsNHsdMcwi, contains a deviant allele. In *Ratpost*, we provide a way to query these variants, which are based on a comparison of the protein-coding sequences of the reference strain with a 'consensus rat genome': by using a simple majority-voting mechanism, the amino acid sequence that is supported by the most strains at each position of each protein is fxed and is considered a synthetic reference to which the BN/SsNHsd-Mcwi sequence is compared. Due to the nature of the data, the following considerations need to be taken into account: (1) as only a limited number of the available rat strains have been sequenced (40 plus the reference strain out of >100 strains), the true consensus sequences cannot be known with certainty; (2) if the sample from the set of strains is biased, then the consensus sequence will be biased as well. This actually the case to some extent for the dataset: there are several closely related strains sequenced (SHR, WKy, and F344 substrains), it is not unlikely that if 1 SHR strain supports a certain variant, all strains will support this variant. However, as shown previously (Fig. [2\)](#page-5-0), these related substrains still contain variants that are not shared by all of them. Overall, all the most common strains are represented in the dataset, while some bias cannot be excluded, we believe that this gives a high-quality overview of variation in commonly used inbred rat strains. For example, the defective mutant

Tyr gene is present in a majority of the sequenced rat strains (32 out of 41), and would be considered as the consensus sequence, so the wild-type *Tyr* sequence of BN/SsNHsd-Mcwi would wrongly be identifed as deviant. These facts mean that, while potentially very informative, care needs to be taken when interpreting the results of this BN/SsNHsd-Mcwi versus the consensus reference. Such variants, with the exception of stop losses (these need to have the 3′ UTR added to detect the presence of a new stop codon in some cases), can be derived from the *Ratpost* database that was constructed as described in the previous section.

A list of reference-strain-specifc variants can thus be obtained in *Ratpost*. Only variants where more than 50% of the strains difer from the reference are included in this analysis. We also provide an agreement score $(S = M1 \times M2)$, which is a number between 0 and 1 that shows how many strains (1) agree with the consensus sequence (metric $M1 = C/N$, *C*: number of strain supporting consensus, *N*: total number of strains) and (2) how many other variants there are for that position that are not the consensus sequence and not the same as BN/SsNHsdMcwi (metric $M2 = 1 - B/N$; *B*: number of strains supporting the BN/ SsNHsdMcwi sequence, *N*: total number of strains), the closer this number is to "1", the more unique the BN/SsNHsdMcwi sequence is. When performing this analysis, we fnd 411 transcripts where the BN/SsNHsdMcwi has a stop-loss variant compared to the consensus sequence and 49 where it has a stop-gain mutation compared to the consensus. For non-synonymous variants, we fnd a total of 5981 variants that difer in the reference rat strain compared to the synthetic consensus sequence. Assuming that the variants with a PROVEAN score of $<-$ 2.5 in the reference are negatively afecting the protein function, there are 1191 variants present that have a negative efect on protein function (out of 5981 in total). It is important to take into account the fact that the variants found in BN/SsNHsdMcwi compared to the consensus sequence across all strains are not always the correct ones, it is not because the large majority of the sequenced strains have a certain agreement sequence that this sequence is the functional one. These results also show that it is important to keep the genetic background of the used animals when using the rat reference genome, which contains its own set of defective alleles. Of the variants with low PROVEAN scores, there are 52 (in 37 transcripts) with an agreement score of $S=1$, i.e., unique to the reference strain (see Table [2](#page-7-0)). One example is a variant unique to the reference that is the gene coding for proline dehydrogenase 1 (*Prodh1*) which has a G373C substitution with a PROVEAN score of − 8.3 as well as a second substitution: G312C with a score of − 8.6. While the reference strain has not been extensively tested in this regard, it is known that mutations in his gene in humans lead to Proline Dehydrogenase deficiency (Afenjar et al. [2007](#page-9-9)). Depending on the residual activity phenotypes can be very mild to severe, manifesting as hyperprolinemia with cognitive defects in severe cases (Afenjar et al. [2007;](#page-9-9) Perry et al. [1968\)](#page-10-22). A second interesting example concerns the *Dclk1* gene, also specifc to the reference strain, which has two amino acid substitutions compared to all other strains, with low PROVEAN scores $(L269F: -3.8$ and V268D: -6.6). Previous work has shown that the reference rat strain precursor (BN/SsNHsd) has an abnormal pre-pulse inhibition (Palmer et al. [2003](#page-10-23)). This trait was linked to two regions in a QTL study (Palmer et al. [2003\)](#page-10-23). The chromosome 2 region encompasses the *Dclk1* gene. This gene belongs to a family of three genes (along with *Dcx*, *Dclk2*) which are all three important for normal neuronal functions (Dijkmans et al. [2010](#page-9-10)). *Dckl1* has been proven to be important for proper neuronal development in mice, based on full KO phenotypes (Koizumi et al. [2006](#page-10-24)). The available data thus make the abnormal Dclk1 protein in BN/SsNHsd a good candidate to explain its pre-pulse inhibition trait.

Finally, the *Ratpost* tool also allows the direct comparison of any two strains. This comparison allows only a list of differing transcripts and their diferences as it is not informative to provide a classifcation in this case. For example, *Tyr* gene can easily be identifed by comparing protein-coding gene sequence diferences between the albino strain SS/Jr and the pigmented strain BN/SsN.

In conclusion, a searchable online repository (which will be updated yearly) of variant alleles of protein-coding genes is now available at *Ratpost* and can lead to extensive exploration and exploitation of the naturally occurring mutant variants fxed in the 40 sequenced rat strains. Our analysis and database concerns protein-coding genes only, and an extension toward non-coding RNAs and a link towards mRNA expression levels might be considered in the future. Combined with the efficient CRISPR/Cas-based mutagenesis, the availability of these naturally occurring sequence variations in these 40 rat strains is an added value to couple sequence variations to phenotypes, and moreover, CRISPR/ Cas could be considered to correct some unwanted variations in the reference strain, upgrading it to a higher standard reference.

Methods

Sequence variation data

We obtained the sequence variation data (SNPs, insertions and deletions) of the inbred strains from the ftp site of the rat genome database (Hermsen et al. [2015](#page-10-13); Smith et al. [2020\)](#page-10-14). Data were converted to bed (vcf2bed) and fltered with bedops (Neph et al. [2012\)](#page-10-25) to retain only events overlapping with exons of coding genes, by using the element

Table 2 A list of variants that are unique to the reference strain with a PROVEAN score<− 2.5

Ensemble gene	Chr	Gene symbol	Ensemble transcript	AA variation	PROVEAN score
ENSRNOG00000026065	$\mathbf{1}$	Slit1	ENSRNOT00000035415	Y869_D870insC	-18.0
ENSRNOG00000026065	$\mathbf{1}$	Slit1	ENSRNOT00000034758	Y869_D870insC	-17.7
ENSRNOG00000032922	2	Dclk1	ENSRNOT00000078337	V268D	-6.7
ENSRNOG00000032922	\overline{c}	Dclk1	ENSRNOT00000093407	V268D	-6.6
ENSRNOG00000032922	\overline{c}	Dclk1	ENSRNOT00000093407	L269F	-3.8
ENSRNOG00000032922	\overline{c}	Dclk1	ENSRNOT00000078337	L269F	-3.7
ENSRNOG00000030212	3	Cerkl	ENSRNOT00000073412	G313V	-6.1
ENSRNOG00000030212	3	Cerkl	ENSRNOT00000043238	G362V	-6.0
ENSRNOG00000030212	3	Cerkl	ENSRNOT00000079781	G269V	-6.0
ENSRNOG00000030212	3	Cerkl	ENSRNOT00000079212	G341V	-5.9
ENSRNOG00000036964	3	Ralgapa2	ENSRNOT00000015637	V429_K430insYR	-21.3
ENSRNOG00000049125	3	LOC684539	ENSRNOT00000072178	C ₁₃₇ S	-4.8
ENSRNOG00000050251	3	MGC105649	ENSRNOT00000073569	D47N	-4.6
ENSRNOG00000007603	5	Gabrr1	ENSRNOT00000010172	P430L	-3.3
ENSRNOG00000023452	5	AABR07050449.1	ENSRNOT00000031978	S346F	-7.9
ENSRNOG00000005965	7	Irak4	ENSRNOT00000007932	K408E	-3.5
ENSRNOG00000032552	7	Zfp799	ENSRNOT00000037708	E385G	-7.6
ENSRNOG00000032552	7	Zfp799	ENSRNOT00000087294	E346G	-7.3
ENSRNOG00000000196	8	Cyp19a1	ENSRNOT00000000212	V156G	-5.9
ENSRNOG00000003144	10	Gprc5c	ENSRNOT00000004256	P333Q	-5.4
ENSRNOG00000003144	10	Gprc5c	ENSRNOT00000086924	P333O	-5.4
ENSRNOG00000003679	10	Med13	ENSRNOT00000035280	I848T	-4.9
ENSRNOG00000007117	10	Cluap1	ENSRNOT00000064964	N362D	-3.7
ENSRNOG00000007117	10	Cluap1	ENSRNOT00000078577	N373D	-3.7
ENSRNOG00000000281	11	Prodh1	ENSRNOT00000082855	C312G	-8.6
ENSRNOG00000000281	11	Prodh1	ENSRNOT00000002576	C373G	-8.3
ENSRNOG00000049282	12	Oas2	ENSRNOT00000077542	G710W	-12.7
ENSRNOG00000012850	15	Kat6b	ENSRNOT00000070893	P826A	-2.7
ENSRNOG00000055935	15	Olr1286	ENSRNOT00000086118	I122R	-7.2
ENSRNOG00000043387	16	Cpe	ENSRNOT00000064297	Y226E	-6.6
ENSRNOG00000043387	16	Cpe	ENSRNOT00000064297	R232H	-3.6
ENSRNOG00000052513	16	Wapl	ENSRNOT00000078390	Q574E	-2.7
ENSRNOG00000059057	16	Shld2	ENSRNOT00000087737	N38K	-3.3
ENSRNOG00000059057	16	Shld2	ENSRNOT00000085012	N38K	-3.1
ENSRNOG00000002509	X	Gnl3l	ENSRNOT00000003397	N369K	-4.8
ENSRNOG00000003707	X	Zmym3	ENSRNOT00000076042	M217_R218insYEAQQQ	-31.1
ENSRNOG00000003707	X	Zmym3	ENSRNOT00000076042	P226_S227insADATRC	-18.7
ENSRNOG00000003707	X	Zmym3	ENSRNOT00000076042	L211_S212insCT	-16.8
ENSRNOG00000003707	$\mathbf X$	Zmym3	ENSRNOT00000076042	I193D	-7.4
ENSRNOG00000003707	X	Zmym3	ENSRNOT00000076042	W196_R198del	-6.1
ENSRNOG00000003707	X	Zmym3	ENSRNOT00000076042	S222Q	-3.3
ENSRNOG00000003707	$\mathbf X$	Zmym3	ENSRNOT00000076042	O194S	-2.7
ENSRNOG00000003707	$\mathbf X$	Zmym3	ENSRNOT00000076042	L199V	-2.7
ENSRNOG00000003707	$\mathbf X$	Zmym3	ENSRNOT00000076042	L195V	-2.6
ENSRNOG00000057706	X	Kdm5c	ENSRNOT00000082902	G232V	-5.8
ENSRNOG00000057706	$\mathbf X$	Kdm5c	ENSRNOT00000078617	G273V	-5.8
ENSRNOG00000057706	$\mathbf X$	Kdm5c	ENSRNOT00000086952	G206V	-5.7
ENSRNOG00000057706	X	Kdm5c	ENSRNOT00000082725	G54V	-5.2
ENSRNOG00000057706	X	Kdm5c	ENSRNOT00000082902	G231V	-4.8
ENSRNOG00000057706	X	Kdm5c	ENSRNOT00000078617	G272V	-4.8

of 1 option with the variant fle as reference and exon locations as query input. All data from the RN5 version of the rat genome were converted to RN6 with the use of the picard tools (LiftoverVcf) (Institute [2019](#page-10-26)) using the RN5 to RN6 chain fle obtained from UCSC.

Reference genome and annotation

We were constrained by the variation data to use the RN6 version of the reference genome. The sequences and corresponding annotation (gene transfer format; gtf) were downloaded from ensemble ftp server. The gtf fle was converted to bed (gtf2bed) and fltered to only retain exons from transcripts containing at least one variant. For this, the fltered set of variants obtained as described in the above section was used as the query for bedops—element of 1, with the exon positions as the reference. Exon sequences were extracted from the reference genome fasta fle with the getfasta command from bedtools using the fltered transcript set.

Transcript classifcation

We used an updated version of the script used in mousepost (Timmermans et al. [2017\)](#page-10-15). The cDNA sequences were constructed using from the previously constructed exon sequences and split up in the 5′ UTR, CDS, and 3′ UTR. For each strain, the sequence variations present for that strain were applied to the CDS. The in silico mutation of the sequence was done using a custom made perl script from the 5′ end to the 3′ end of the sequences in order to easily take into account sequence ofsets from indels. All genomic positions were converted to cDNA/CDS positions internally and applied in sequence, negative-strand sequences were reverse complemented for further processing. Finally, the CDS was translated to the protein sequence, using the standard vertebrate coding table. Classifcation was performed by comparing the reference and alternate aa sequences into three classes (SG, SL, MUT). For SG, any offsets from indels were taken into account, and SL variants were called on the loss of the canonical stop codon, in which case the 3′UTR, with variants applied (same as CDS), was appended to the CDS and a scan for a new stop codon was done. All variants not classed as SG/SL were placed as MUT, and

all processing was stopped after encountering a SG-classed variant. Transcripts were assigned to the most severe variant class. We processed all strains in parallel.

BLAST databases

The BLAST+ program suite, v2.2.30, was pre-installed on the HPC infrastructure, and BLAST databases for the blast tools were obtained from the NCBI ftp site. The database with non-redundant protein sequences for use with PROVEAN was downloaded November 16, 2016 ([ftp://ftp.ncbi.nlm.nih.gov/blast/db/\)](ftp://ftp.ncbi.nlm.nih.gov/blast/db/). This will be used by the PROVEAN software, more specifcally, the psi-blast program.

PROVEAN

Several programs have been developed to estimate the effect of a given sequence variation on the function of the protein. Because PROVEAN is able to interpret small insertions and deletions, this tool was selected (Choi and Chan [2015b\)](#page-9-11). First, a fle for each transcript in each strain was constructed with the mutated positions. For this, a global pairwise sequence alignment was constructed between the reference and alternative transcript with needle (EMBOSS tools) (Madeira et al. [2019](#page-10-27)). This alignment file, along with the positional data from the classifcation step, was processed with a perl script that was specifcally created to build these fles. To keep run times within acceptable limits, the PROVEAN tool was run on a high-performance computing (HPC) cluster for each strain in sequence; in this way, we could save and reuse the supported sequence sets. Due to the high computational requirements and limitations in HPC access, some variants were excluded from PROVEAN analysis: all variants from strain pairwise comparisons were excluded, as the PROVEAN scores are only truly relevant in comparison to a reference and variants from SL- and SG-classed transcripts were also not processed with PROVEAN. The score provided by PROVEAN depends in part on the number of available sequences for a given transcript. We have followed the suggestions of the authors of the PROVEAN tool and show a waring if the number of sequences is < 50 , which may give unreliable results, and we use a score of -2.5 as a ceiling cut-off for potentially deleterious variants (Choi and Chan [2015b](#page-9-11)).

Gene ontology

The gene ontology (GO) annotation was downloaded from the gene ontology consortium website ([www.geneontolo](http://www.geneontology.org) [gy.org\)](http://www.geneontology.org). We processed this fle to obtain the GO terms for all genes in our dataset to allow the GO search functionality in the web tool.

Data storage & presentation

All results from the analyses are stored in a MySQL relational database. Database tables are interlinked and have been optimized with indexes to allow fast searches. This database is made accessible through the website ratpost.be, built on the bootstrap 4 framework php and javascript. All tables found are created by use of the DataTables plugin.

Author contributions ST performed all the analysis and built the *Ratpost* website and wrote the manuscript. CL supervised the research and edited and fnalized the manuscript.

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Data availability All data used are publicly available at the rat genome database. All results can be found on the website mousepose.be.

Compliance with ethical standards

Conflict of interest On behalf of all authors, the corresponding author states that there is no confict of interest.

Ethical approval Not applicable.

Consent for publication Not applicable.

References

- Afenjar A, Moutard ML, Doummar D, Guet A, Rabier D, Vermersch AI, Mignot C, Burglen L, Heron D, Thioulouse E, de Villemeur TB, Campion D, Rodriguez D (2007) Early neurological phenotype in 4 children with biallelic PRODH mutations. Brain Dev 29:547–552
- Atanur SS, Diaz AG, Maratou K, Sarkis A, Rotival M, Game L, Tschannen MR, Kaisaki PJ, Otto GW, Ma MC, Keane TM, Hummel O, Saar K, Chen W, Guryev V, Gopalakrishnan K, Garrett MR, Joe B, Citterio L, Bianchi G, McBride M, Dominiczak A, Adams DJ, Serikawa T, Flicek P, Cuppen E, Hubner N, Petretto E, Gauguier D, Kwitek A, Jacob H, Aitman TJ (2013) Genome

sequencing reveals loci under artifcial selection that underlie disease phenotypes in the laboratory rat. Cell 154:691–703

- Barefeld DY, Puckelwartz MJ, Kim EY, Wilsbacher LD, Vo AH, Waters EA, Earley JU, Hadhazy M, Dellefave-Castillo L, Pesce LL, McNally EM (2017) Experimental modeling supports a role for MyBP-HL as a novel myoflament component in arrhythmia and dilated cardiomyopathy. Circulation 136:1477–1491
- Bergman I, Basse PH, Barmada MA, Griffin JA, Cheung NK (2000) Comparison of in vitro antibody-targeted cytotoxicity using mouse, rat and human efectors. Cancer Immunol Immunother CII 49:259–266
- Blaszczyk WM, Arning L, Hofmann KP, Epplen JT (2005) A Tyrosinase missense mutation causes albinism in the Wistar rat. Pigment Cell Res 18:144–145
- Choi Y, Chan AP (2015a) PROVEAN web server: a tool to predict the functional efect of amino acid substitutions and indels. Bioinformatics (Oxford, England) 31:2745–2747
- Choi Y, Chan AP (2015b) PROVEAN web server: a tool to predict the functional efect of amino acid substitutions and indels. Bioinformatics 31:2745–2747
- Choi Y, Sims GE, Murphy S, Miller JR, Chan AP (2012) Predicting the functional efect of amino acid substitutions and indels. PLoS One 7:e46688
- Conrad CH, Brooks WW, Hayes JA, Sen S, Robinson KG, Bing OH (1995) Myocardial fbrosis and stifness with hypertrophy and heart failure in the spontaneously hypertensive rat. Circulation 91:161–170
- Dijkmans TF, van Hooijdonk LW, Fitzsimons CP, Vreugdenhil E (2010) The doublecortin gene family and disorders of neuronal structure. Cent Nerv Syst Agents Med Chem 10:32–46
- Ellenbroek B, Youn J (2016) Rodent models in neuroscience research: is it a rat race? Dis Models Mech 9:1079–1087
- EUR-Lex—52020DC0016—EN—EUR-Lex
- Gibbs RA, Weinstock GM, Metzker ML, Muzny DM, Sodergren EJ, Scherer S, Scott G, Stefen D, Worley KC, Burch PE, Okwuonu G, Hines S, Lewis L, DeRamo C, Delgado O, Dugan-Rocha S, Miner G, Morgan M, Hawes A, Gill R, Holt RA, Adams MD, Amanatides PG, Baden-Tillson H, Barnstead M, Chin S, Evans CA, Ferriera S, Fosler C, Glodek A, Gu Z, Jennings D, Kraft CL, Nguyen T, Pfannkoch CM, Sitter C, Sutton GG, Venter JC, Woodage T, Smith D, Lee HM, Gustafson E, Cahill P, Kana A, Doucette-Stamm L, Weinstock K, Fechtel K, Weiss RB, Dunn DM, Green ED, Blakesley RW, Boufard GG, De Jong PJ, Osoegawa K, Zhu B, Marra M, Schein J, Bosdet I, Fjell C, Jones S, Krzywinski M, Mathewson C, Siddiqui A, Wye N, McPherson J, Zhao S, Fraser CM, Shetty J, Shatsman S, Geer K, Chen Y, Abramzon S, Nierman WC, Havlak PH, Chen R, Durbin KJ, Egan A, Ren Y, Song XZ, Li B, Liu Y, Qin X, Cawley S, Worley KC, Cooney AJ, D'Souza LM, Martin K, Wu JQ, Gonzalez-Garay ML, Jackson AR, Kalafus KJ, McLeod MP, Milosavljevic A, Virk D, Volkov A, Wheeler DA, Zhang Z, Bailey JA, Eichler EE, Tuzun E, Birney E, Mongin E, Ureta-Vidal A, Woodwark C, Zdobnov E, Bork P, Suyama M, Torrents D, Alexandersson M, Trask BJ, Young JM, Huang H, Wang H, Xing H, Daniels S, Gietzen D, Schmidt J, Stevens K, Vitt U, Wingrove J, Camara F, Mar Alba M, Abril JF, Guigo R, Smit A, Dubchak I, Rubin EM, Couronne O, Poliakov A, Hubner N, Ganten D, Goesele C, Hummel O, Kreitler T, Lee YA, Monti J, Schulz H, Zimdahl H, Himmelbauer H, Lehrach H, Jacob HJ, Bromberg S, Gullings-Handley J, Jensen-Seaman MI, Kwitek AE, Lazar J, Pasko D, Tonellato PJ, Twigger S, Ponting CP, Duarte JM, Rice S, Goodstadt L, Beatson SA, Emes RD, Winter EE, Webber C, Brandt P, Nyakatura G, Adetobi M, Chiaromonte F, Elnitski L, Eswara P, Hardison RC, Hou M, Kolbe D, Makova K, Miller W, Nekrutenko A, Riemer C, Schwartz S, Taylor J, Yang S, Zhang Y, Lindpaintner K, Andrews TD, Caccamo M, Clamp M, Clarke L, Curwen V, Durbin R, Eyras E, Searle

SM, Cooper GM, Batzoglou S, Brudno M, Sidow A, Stone EA, Venter JC, Payseur BA, Bourque G, Lopez-Otin C, Puente XS, Chakrabarti K, Chatterji S, Dewey C, Pachter L, Bray N, Yap VB, Caspi A, Tesler G, Pevzner PA, Haussler D, Roskin KM, Baertsch R, Clawson H, Furey TS, Hinrichs AS, Karolchik D, Kent WJ, Rosenbloom KR, Trumbower H, Weirauch M, Cooper DN, Stenson PD, Ma B, Brent M, Arumugam M, Shteynberg D, Copley RR, Taylor MS, Riethman H, Mudunuri U, Peterson J, Guyer M, Felsenfeld A, Old S, Mockrin S, Collins F, Rat Genome Sequencing Project C (2004) Genome sequence of the Brown Norway rat yields insights into mammalian evolution. Nature 428:493–521

- Hedrich HJ (2000) History, strains and models. In: Krinke GJ (ed) The laboratory rat. Elsevier, pp 3–16
- Hermsen R, de Ligt J, Spee W, Blokzijl F, Schafer S, Adami E, Boymans S, Flink S, van Boxtel R, van der Weide RH, Aitman T, Hubner N, Simonis M, Tabakoff B, Guryev V, Cuppen E (2015) Genomic landscape of rat strain and substrain variation. BMC Genom 16:357
- Holl K, He H, Wedemeyer M, Clopton L, Wert S, Meckes JK, Cheng R, Kastner A, Palmer AA, Redei EE, Solberg Woods LC (2018) Heterogeneous stock rats: a model to study the genetics of despairlike behavior in adolescence. Genes Brain Behav 17:139–148
- Institute B (2019) Picard toolkit. In: Broad Institute, GitHub repository
- Jonckers E, Van Audekerke J, De Visscher G, Van der Linden A, Verhoye M (2011) Functional connectivity fMRI of the rodent brain: comparison of functional connectivity networks in rat and mouse. PLoS One 6:e18876
- Koizumi H, Tanaka T, Gleeson JG (2006) Doublecortin-like kinase functions with doublecortin to mediate fber tract decussation and neuronal migration. Neuron 49:55–66
- Leong XF, Ng CY, Jaarin K (2015) Animal models in cardiovascular research: hypertension and atherosclerosis. BioMed Res Int 2015:528757
- Liu T, Li H, Ding G, Wang Z, Chen Y, Liu L, Li Y, Li Y (2015) Comparative genome of GK and Wistar rats reveals genetic basis of type 2 diabetes. PLoS One 10:e0141859
- Logan CA (1999) The altered rationale for the choice of a standard animal in experimental psychology: Henry H. Donaldson, Adolf Meyer, and "the" albino rat. Hist Psychol 2:3–24
- Madeira F, Park YM, Lee J, Buso N, Gur T, Madhusoodanan N, Basutkar P, Tivey ARN, Potter SC, Finn RD, Lopez R (2019) The EMBL-EBI search and sequence analysis tools APIs in 2019. Nucleic Acids Res 47:W636–W641
- Modlinska K, Pisula W (2020) The Norway rat, from an obnoxious pest to a laboratory pet. eLife 9:e50651
- Neph S, Kuehn MS, Reynolds AP, Haugen E, Thurman RE, Johnson AK, Rynes E, Maurano MT, Vierstra J, Thomas S, Sandstrom R, Humbert R, Stamatoyannopoulos JA (2012) BEDOPS: high-performance genomic feature operations. Bioinformatics 28:1919–1920
- O'Leary NA, Wright MW, Brister JR, Ciufo S, Haddad D, McVeigh R, Rajput B, Robbertse B, Smith-White B, Ako-Adjei D, Astashyn A, Badretdin A, Bao Y, Blinkova O, Brover V, Chetvernin V, Choi J, Cox E, Ermolaeva O, Farrell CM, Goldfarb T, Gupta T, Haft D, Hatcher E, Hlavina W, Joardar VS, Kodali VK, Li W, Maglott D, Masterson P, McGarvey KM, Murphy MR, O'Neill K, Pujar S, Rangwala SH, Rausch D, Riddick LD, Schoch C,

Shkeda A, Storz SS, Sun H, Thibaud-Nissen F, Tolstoy I, Tully RE, Vatsan AR, Wallin C, Webb D, Wu W, Landrum MJ, Kimchi A, Tatusova T, DiCuccio M, Kitts P, Murphy TD, Pruitt KD (2016) Reference sequence (RefSeq) database at NCBI: current status, taxonomic expansion, and functional annotation. Nucleic Acids Res 44:D733-745

- Obrosova IG, Drel VR, Kumagai AK, Szabo C, Pacher P, Stevens MJ (2006) Early diabetes-induced biochemical changes in the retina: comparison of rat and mouse models. Diabetologia 49:2525–2533
- Palmer AA, Breen LL, Flodman P, Conti LH, Spence MA, Printz MP (2003) Identifcation of quantitative trait loci for prepulse inhibition in rats. Psychopharmacology 165:270–279
- Perry TL, Hardwick DF, Lowry RB, Hansen S (1968) Hyperprolinaemia in two successive generations of a North American Indian family. Ann Hum Genet 31:401–407
- Philipeaux JM (1856) Note sur l'exstirpation des capsules surrenales chez les rats albinos (Mus rattus). Comptes rendus hebdomadaires des séances de l'Académie des sciences 43:904–906
- Podcheko A, Northcott P, Bikopoulos G, Lee A, Bommareddi SR, Kushner JA, Farhang-Fallah J, Rozakis-Adcock M (2007) Identifcation of a WD40 repeat-containing isoform of PHIP as a novel regulator of beta-cell growth and survival. Mol Cell Biol 27:6484–6496
- Richter CP (1959) Rats, man, and the welfare-state. Am Psychol 14:18–28
- Savory W (1863) Experiments on food; its destination and uses. Lancet 81:381–383
- Sharp PE, Villano JS (2013) The laboratory rat, 2nd edn. CRC Press, Boca Raton
- Smith JR, Hayman GT, Wang SJ, Laulederkind SJF, Hofman MJ, Kaldunski ML, Tutaj M, Thota J, Nalabolu HS, Ellanki SLR, Tutaj MA, De Pons JL, Kwitek AE, Dwinell MR, Shimoyama ME (2020) The year of the rat: the rat genome database at 20: a multi-species knowledgebase and analysis platform. Nucleic Acids Res 48:D731–D742
- Stumvoll M, Goldstein BJ, van Haeften TW (2005) Type 2 diabetes: principles of pathogenesis and therapy. Lancet (London, England) 365:1333–1346
- Timmermans S, Libert C (2018) Overview of inactivating mutations in the protein-coding genome of the mouse reference strain C57BL/6J. JCI Insight 3(13):e121758
- Timmermans S, Van Montagu M, Libert C (2017) Complete overview of protein-inactivating sequence variations in 36 sequenced mouse inbred strains. Proc Natl Acad Sci USA 114:9158–9163
- Trippodo NC, Frohlich ED (1981) Similarities of genetic (spontaneous) hypertension. Man and rat. Circ Res 48:309–319
- Watson JB (1914) Behavior: an introduction to comparative psychology. Holt, Rinehart and Winston, New York
- Woods LC, Mott R (2017) Heterogeneous stock populations for analysis of complex traits. Methods Mol Biol (Clifton, NJ) 1488:31–44

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