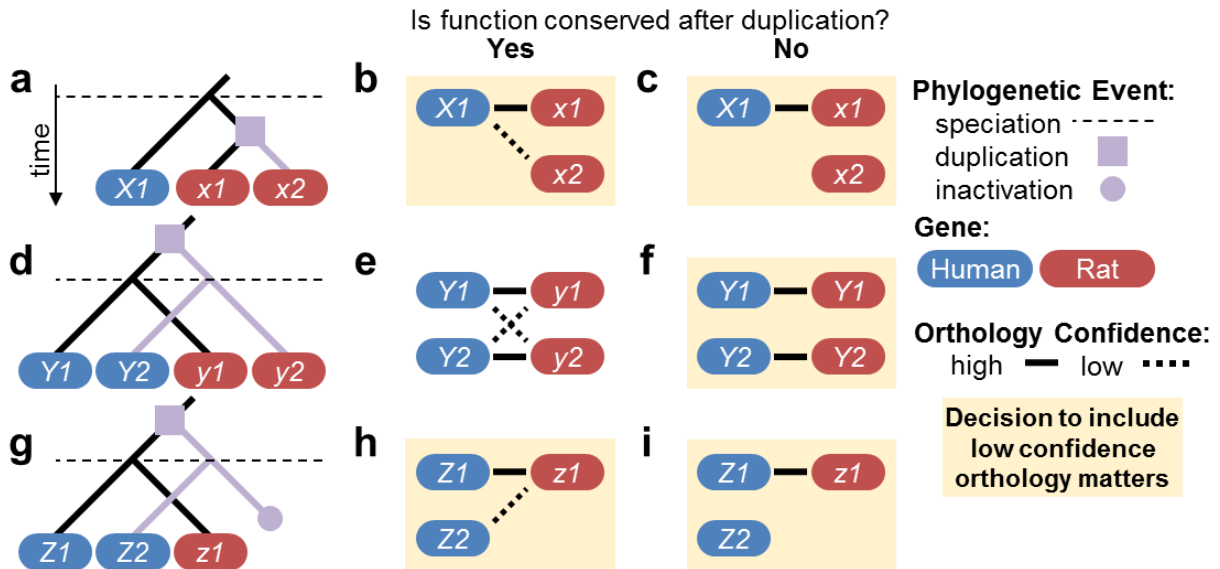


1 Supplementary Figures



2

3 **Supplementary Figure 1 – Inferring function between orthologs is not trivial.**

4 (a) Example of the evolutionary history of a single gene in the most recent common ancestor of
 5 rats and humans that underwent a duplication event in rats but not humans after speciation.

6 From this evolutionary relationship, $X1$ may be annotated to two orthologs, $x1$ and $x2$.

7 Orthologous pairs of rat and human genes separated by shorter evolutionary distances were
 8 classified as high confidence and assigned the same number.

9 (b) Assuming that function is conserved across $X1$, $x1$, and $x2$ after speciation and duplication

10 events, metabolic reactions associated with $X1$ in a human GENRE should be associated with

11 $x1$ and $x2$ as isozymes in a rat GENRE. This example highlights the importance of including

12 multiple orthology annotations when converting GPR rules between species, even when $X1$ and

13 $x1$ has stronger evidence for orthology than $X1$ and $x2$.

14 (c) Assuming $X1$ and $x1$ catalyze the same metabolic function but $x2$ evolved an affinity for a

15 different substrate after duplication, metabolic reactions associated with $X1$ in a human GENRE

16 should only be associated with $x1$ and not $x2$. This example suggests that some orthology

17 annotations may need to be discarded during the GPR conversion process (and potentially

18 assigned to a new rat-specific reaction).

19 **(d)** Evolutionary history of a single ancestral gene that was duplicated before speciation
20 resulting in two human genes, $Y1$ and $Y2$, and two rat genes, $y1$ and $y2$.

21 **(e)** Assuming that function is conserved across $Y1$, $y1$, $Y2$, and $y2$ after duplication and
22 speciation events, metabolic reactions associated with $Y1$ and $Y2$ as isozymes in a human
23 GENRE should be also be associated with $y1$ and $y2$ as isozymes in a rat GENRE.

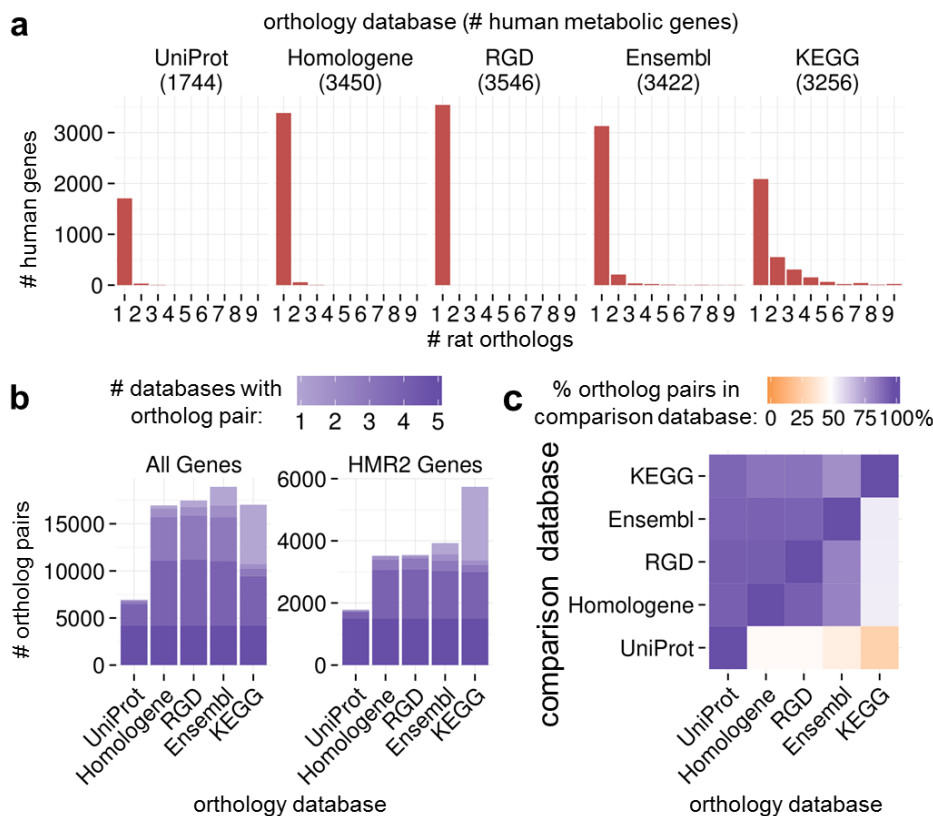
24 **(f)** If the ancestral gene of $Y2/y2$ evolved a novel function shortly before speciation and after
25 duplication from the ancestral gene of $Y1/y1$, integrating low confidence orthology annotations
26 between $Y1/y2$ and $Y2/y1$ into the GPR conversion process could generate GPR rules with
27 twice as many rat genes as human genes.

28 **(g)** Evolutionary history of a single ancestral gene that was duplicated before speciation
29 resulting in two human genes, $Z1$ and $Z2$, but only one rat gene, $z1$, after a loss of function
30 mutation in the rat descendent of $Z2$'s ancestral gene.

31 **(h)** Assuming that function is conserved between $Z1$, $z1$, and $Z2$, metabolic reactions
32 associated with $Z1$ and $Z2$ as isozymes in a human GENRE would only be catalyzed by $z1$ in a
33 rat GENRE.

34 **(i)** If $Z1$ and $Z2$ were known to catalyze distinct reactions in a human GENRE, low confidence
35 orthology annotations between $Z2/z1$ might inappropriately suggest the addition of a human-
36 specific reaction to a rat GENRE.

37



38

39 **Supplementary Figure 2 – Summary of orthology annotations between rat and human**
 40 **genes from five orthology databases.**

41 (a) Distributions of the numbers of rat orthologs annotated to individual human genes from each
 42 database. Numbers below each database name indicate the total numbers of human metabolic
 43 genes from HMR2 with at least one rat ortholog. Human genes with more than 9 orthologs are
 44 not shown.

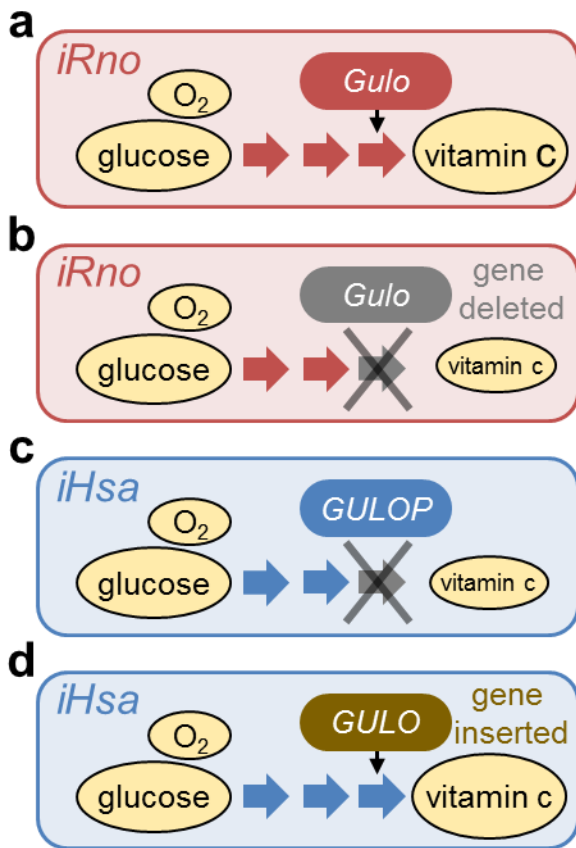
45 (b) Numbers of ortholog pairs from each orthology database that are also annotated in other
 46 orthology databases. Lighter and darker purple represent weaker and stronger consensus
 47 among databases, respectively.

48 (c) Percent of ortholog pairs in each database (x-axis) that overlapped with in orthology
 49 annotations in other databases (y-axis).

50

63 from any database (bottom row) generated rat GPR rules that were frequently larger than the
64 original human GPR rules, unless each human gene was limited to one ortholog (bottom left
65 panel). Requiring orthology annotations to be described by at least 3 different databases
66 (middle row) increased the numbers of reactions automatically annotated as human-specific
67 (blue dots) and provided human GPR rules that were frequently larger than rat GPR rules.
68 Ultimately, the pair of selected cutoff parameters (boxed panel) used in the GPR conversion
69 process provided balanced numbers of disproportionately sized GPR rules between draft rat
70 and human networks.

71



72

73 **Supplementary Figure 4 – Simplified metabolic network diagrams capturing the known**
 74 **functional importance of L-gulonolactone oxidase in vitamin C synthesis.**

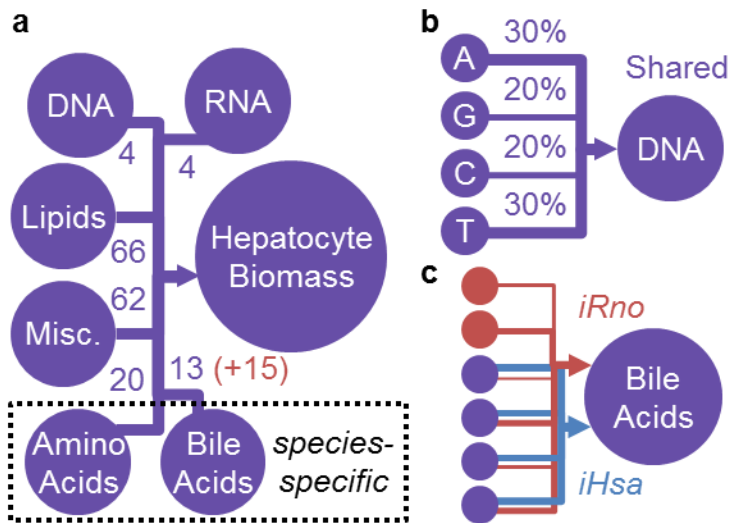
75 (a) Rats are capable of synthesizing vitamin C from limited substrates which was captured by
 76 *iRno*. The last enzymatic step of this process is known to be catalyzed by *Gulo*.

77 (b) By simulating the deletion of *Gulo* with *iRno*, rats were no longer predicted to be capable of
 78 synthesizing vitamin C given glucose and oxygen.

79 (c) Humans cannot synthesize vitamin C from limited substrates which was captured by *iHsa*.
 80 The human ortholog of the rat gene, *Gulo*, is a non-functional pseudogene.

81 (d) By simulating the knock-in of a functional equivalent to *Gulo* in humans, *iHsa* was capable of
 82 performing *de novo* vitamin C synthesis.

83



95

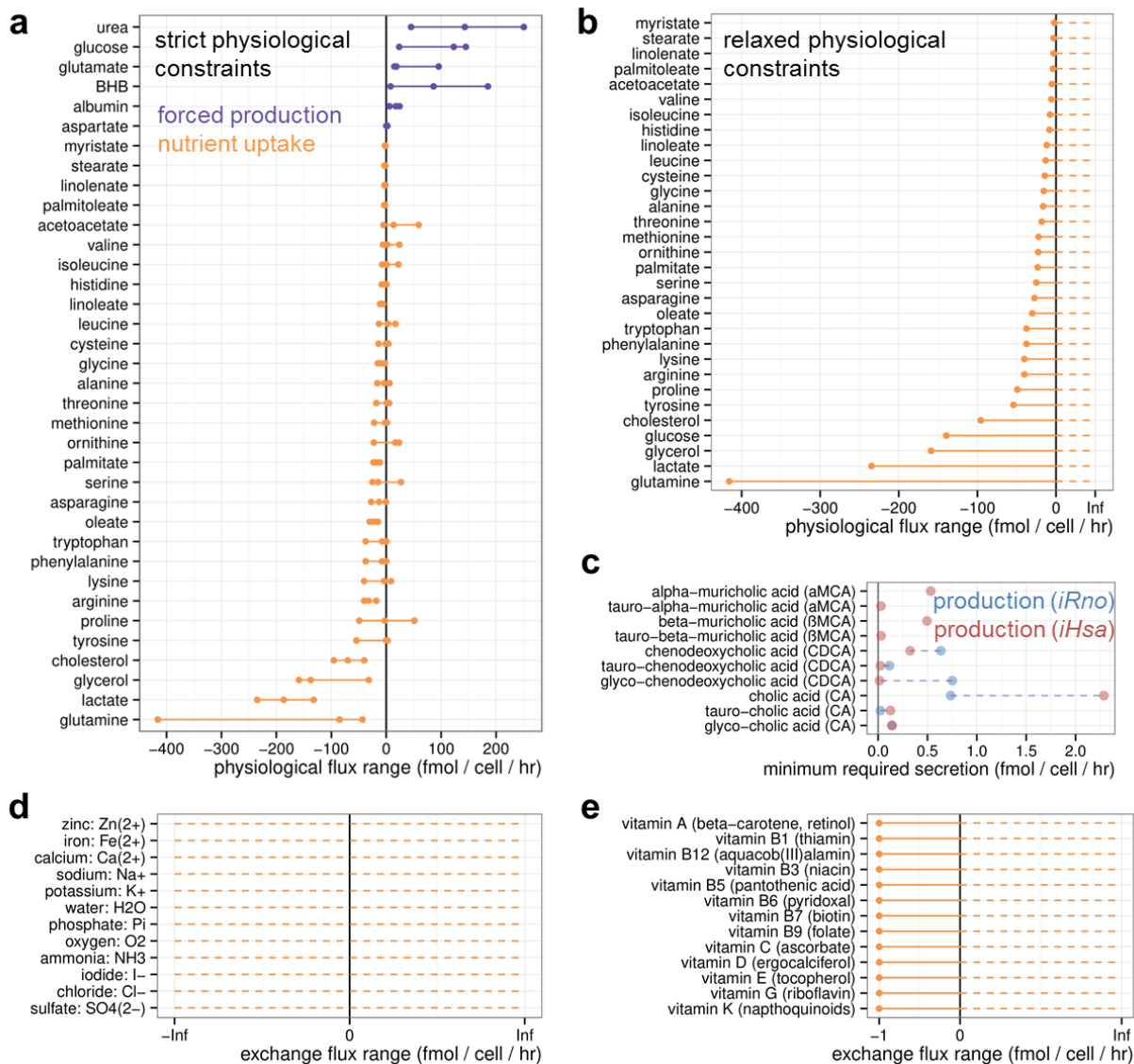
96 **Supplementary Figure 6 – A unified biomass reaction was created for rat and human**
 97 **hepatocytes to enable comparative predictions using *iRno* and *iHsa*.**

98 (a) Each metabolite consumed in the hepatocyte biomass reaction represents an “average”
 99 biomass subcomponent that is synthesized in a separate reaction (b-c). DNA, RNA, lipids, and
 100 miscellaneous metabolites (misc) like glycogen and vitamin C were assigned species-
 101 independent synthesis reactions. Bile acids and amino acids, which can vary significantly
 102 between species, were assigned species-specific synthesis reactions in *iRno* and *iHsa*.
 103 Numbers indicate how many unique metabolites are shared (purple) or rat-specific (red) within
 104 each biomass subcomponent.

105 (b) The biomass subcomponent for an average DNA molecule is produced by consuming
 106 experimentally-derived ratios of individual deoxynucleotides. In this reaction, more adenine (A)
 107 and thymine (T) are incorporated into DNA than cytosine (C) and guanine (G) as indicated by
 108 percent labels and by line thickness.

109 (c) Synthesis of an “average” bile acid was defined separately for *iRno* and *iHsa* in order to
 110 account for species-specific metabolites (muricholic acids) and relative abundances.

111 *Each lipid metabolite is comprised of glycerol backbones with 1-3 fatty acid chains of various
 112 lengths, representing over 100 unique metabolites, as extensively curated in HMR2.

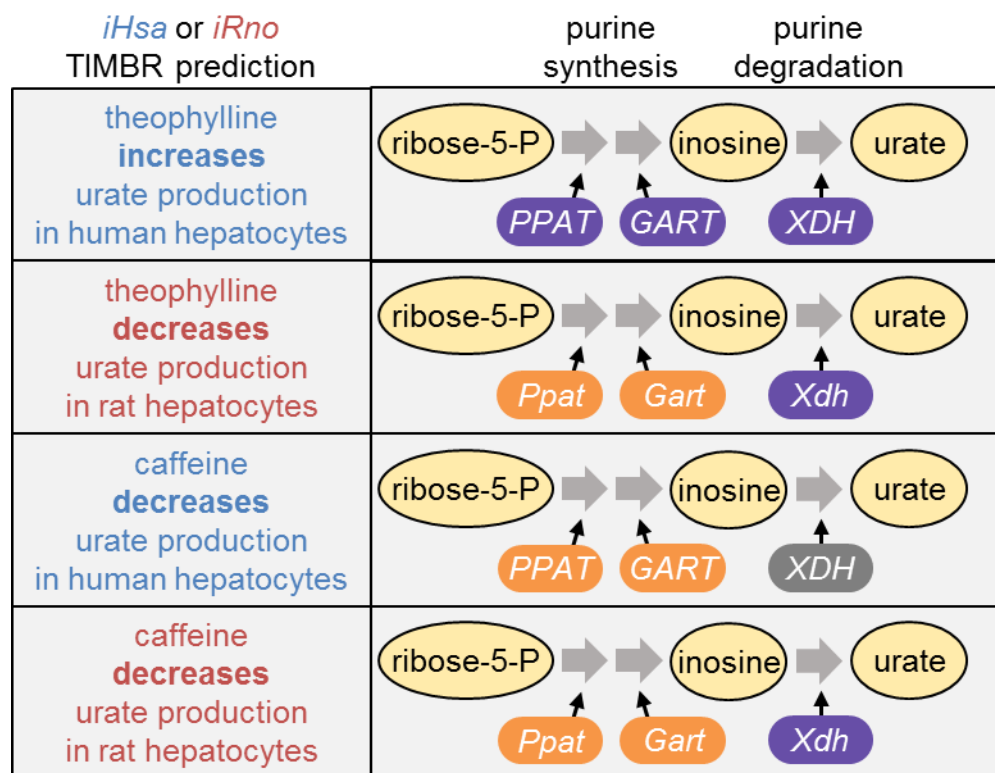


113

114 **Supplementary Figure 7 – Physiological constraints applied to *iRno* and *iHsa*.**

115 (a) Experimentally reported flux measurements from rat hepatocytes were obtained from six
 116 separate studies to constrain *iRno* and *iHsa* with exchange boundaries that represent
 117 physiological conditions. Minimum, median, and maximum reported exchange fluxes in fmol cell⁻¹
 118 hour⁻¹ are shown for each metabolite. Reaction lower bounds for exchange metabolites were
 119 set to the minimum reported value (leftmost point) as strict physiological constraints. For
 120 simulations of hepatocyte growth using the biomass objective, the maximum value for each
 121 metabolite was also applied as the upper bound to exchange reactions. Exchange fluxes for

122 albumin were scaled to represent the secretion of an average amino acid from albumin because
123 the albumin metabolite represents a full-length protein with 608 amino acids (in rats).
124 (b) Experimentally reported flux measurements from (a) were also applied as relaxed
125 physiological constraints for toxicogenomics biomarker predictions. Reaction lower bounds with
126 positive values (forced production) were set to zero and upper bounds with negative values
127 (forced consumption) were set to positive infinity (10^6).
128 (c) Species-specific constraints required distinct quantities of bile acids to be produced under
129 strict physiological conditions in hepatocytes. Each point represents the lower bound applied to
130 either *iRno* (red) or *iHsa* (blue) based on serum concentrations in rats and humans,
131 respectively. Synthesis and secretion of α - and β -muricholic acids in both taurine-conjugated
132 and unconjugated forms were only requirements for *iRno*.
133 (d) Inorganic ions were allowed unconstrained consumption rates of -10^6 fmol cell⁻¹ hour⁻¹.
134 (e) Cofactors and vitamins considered essential in humans were set to an uptake value of 1
135 fmol cell⁻¹ hour⁻¹ in rat and human networks.
136



treatment-specific gene expression changes
that contributed to species-specific differences
in TIMBR predictions for urate production:

upregulated
unchanged
downregulated

137

138 **Supplementary Figure 8** – By comparing reaction weights and reaction fluxes associated with

139 urate production, we found that two human enzymes involved in *de novo* purine synthesis,

140 *PPAT* and *GART*, were upregulated in response to theophylline but downregulated in response

141 to caffeine. In contrast, rat orthologs for these genes (*Ppat* and *Gart*) were downregulated by

142 both caffeine and theophylline. A human enzyme involved in purine degradation, xanthine

143 oxidase (*XDH*), was also upregulated by theophylline but unaffected by caffeine; however, the

144 rat ortholog, *Xdh*, was upregulated in response to both compounds. These results suggest that

145 activation of purine synthesis and purine degradation pathways might also play mechanistic

146 roles in the human-specific elevation of urate after theophylline treatment.

147

148 Supplementary Methods

149 **Converting a human metabolic network into a draft rat metabolic network**

150 The first step in transforming a human metabolic model into a rat metabolic model involved
151 assigning GPR rules consisting of rat genes to reactions in HMR2³ associated with human GPR
152 rules. Metabolic networks are typically comprised of two fundamental components: the
153 stoichiometric relationships between metabolites and reactions, termed the stoichiometric matrix
154 or S-matrix, and Boolean relationships between enzymes that catalyze a reaction, termed gene-
155 protein-reaction GPR association rules. Reactions and metabolites in the S-matrix were
156 assumed to be organism-independent because the molecular building blocks of a cell such as
157 amino acids, nucleic acids, and membrane lipids are generally consistent across multiple
158 species. In contrast, enzymes catalyzing reactions within the GPR rules of HMR2 were
159 specifically encoded by the human genome, necessitating distinct formulations of GPR rules for
160 the rat genome.

161

162 **Inferring metabolic function through orthology annotations**

163 To construct a genome-scale network reconstruction (GENRE) of rat metabolism, human genes
164 assigned to metabolic reactions in a human GENRE through gene-protein-reaction (GPR)
165 relationship rules were replaced with orthologous rat genes. Inferring metabolic function through
166 orthology is not trivial because orthologs descended from the most recent common ancestor of
167 rats and humans have endured more than 50 million years of evolutionary pressures
168 (**Supplementary Fig. 1**). Additionally, mutations involving the duplication and/or inactivation of
169 gene after speciation can lead to one-to-many, many-to-many, or many-to-one orthology
170 annotations between rat and human genes⁴.

171

172 A consensus approach was used to assign a confidence score to each pair of human and rat
173 orthologs for initial construction of the rat GENRE, *iRno*. We developed a quantitative method to
174 infer metabolic function by incorporating the collective efforts of multiple genome annotation
175 communities: UniProt, Homologene, RGD, Ensembl, and KEGG. Using these five orthology
176 databases, we assigned a confidence score to deprioritize the conversion of ortholog pairs that
177 were annotated in fewer databases. This prioritization step was implemented to filter out low
178 confidence orthology annotations due to the possibility that function may not be conserved as
179 described in **Supplementary Fig. 1a**. We anticipate that using orthology annotations derived
180 from multiple computational methods will be more robust than quantitative methods such as
181 BLAST because a single point mutation could be sufficient to alter the basic function of a
182 metabolic enzyme while orthologs with low sequence similarity can catalyze similar reactions⁴.

183
184 We compared orthology databases to highlight the advantages and disadvantages of using a
185 consensus approach versus an individual database (**Supplementary Fig. 2**). Surprisingly, the
186 distribution of rat orthologs annotated to each human gene varied substantially between
187 orthology databases (**Supplementary Fig. 2a**). Over a third of human genes were annotated to
188 two or more rat orthologs in KEGG while RGD was restricted to one rat ortholog per human
189 gene. Despite this limitation, RGD had the highest coverage of human genes with orthology
190 annotations compared to KEGG which had the second least. UniProt covered the fewest human
191 genes but most orthology annotations were consistently found in at least 4 of 5 orthology
192 databases (**Supplementary Fig. 2b**). Based on this information, orthology annotations from
193 UniProt alone might not be sufficient to carry out the GPR conversion process at the genome-
194 scale; however, UniProt could be useful in a consensus-based GPR conversion method by
195 reinforcing confidence in a core subset of well-annotated ortholog pairs. Most ortholog pairs
196 were annotated in multiple databases although KEGG also included a large number of unique
197 ortholog pairs (**Supplementary Fig. 2b**). Each database added between 12 and 514 unique

198 human genes originally represented in HMR2 and between 16 and 2371 unique ortholog pairs
199 not found in any of the other four databases. The percentage of non-overlapping ortholog pairs
200 between any two databases was less than 50% with the exception of UniProt (**Supplementary**
201 **Fig. 2c**). Despite a moderate degree of overlap, these data suggest that no consensus has
202 been established among orthology annotation resources. As an alternative to choosing a single
203 orthology database, a consensus approach would reduce the number of unconverted human
204 genes and potentially capture more evolutionary differences in between rats and humans
205 (**Supplementary Fig. 1**).

206
207 Aggregating orthology annotations from multiple databases increases the risk of inappropriately
208 replacing human genes with rat orthologs that do not perform the same function. To identify a
209 high-quality subset of orthology information that preserved functionality and GPR sizes between
210 drafts of *iRno* and *iHsa*, we developed a consensus-based GPR conversion algorithm that
211 required orthologs to be annotated in at least 1-5 databases and limited individual human genes
212 to be replaced by a maximum of 1-5 rat orthologs (**Supplementary Fig. 3**). The orthology
213 database consensus score was defined as the number of databases in which a unique pair of
214 rat and human genes was annotated. Rat and human genes were represented with Entrez gene
215 identifiers to evaluate the presence of ortholog pairs across all five databases. Entrez gene
216 mappings were included by default for RGD, Homologene, and KEGG orthology databases
217 while UniProt protein entries and Ensembl gene identifiers were mapped to Entrez genes by
218 customizing data output options within each database. When limiting the maximum number of
219 rat orthologs that replace each human gene, orthologs were first prioritized by consensus
220 orthology scores followed by gene scores based on genome annotation information from NCBI,
221 UniProt, and Ensembl. Four subjective parameters were discretized into integer values between
222 zero and five and summed to calculate gene scores: UniProt gene evidence level (protein = 5;
223 transcript = 4; inferred from homology = 3; predicted = 2; uncertain = 1; no data = 0), UniProt

224 Annotation Score (score between 1 and 5 = value; no data = 0), Ensembl gene status (known =
225 5; known by projection = 4; novel = 3; putative = 1; no data = 0), NCBI protein-coding evidence
226 (evidence = 5; otherwise = 0). Rat orthology ranks for each human gene in each reaction were
227 determined by sorting consensus orthology scores in descending order followed by rat gene
228 score in descending order.

229
230 Without filtering orthology annotations, rat GPR rules were often much larger than human GPR
231 rules. After manually checking the accuracy of rat GPR rules in the context of genome
232 annotations, orthology annotations between closely related but functionally distinct enzymes
233 were common after converting the unfiltered set of orthologs. The orthology database score and
234 the orthology rank were developed as filtering metrics to avoid inferring function based on non-
235 specific orthology annotations that can be interpreted as false positives for metabolic reactions.
236 However, accurate orthology annotations would also be discarded when applying stringent
237 threshold values, decreasing the sensitivity of the approach. Instead of choosing arbitrary
238 cutoffs for these parameters, a network-driven approach was developed to identify a subset of
239 orthology annotations that maintains a reasonable balance between sensitivity and specificity.

240
241 A network-driven approach was used to select cutoff values for the minimum orthology
242 database score and the maximum orthology rank. We found that converting all orthology
243 annotations present in any of the 5 orthology databases generated rat GPR rules with
244 disproportionately more genes compared to the original human GPR rules (bottom row of
245 panels in **Supplementary Fig. 3**). We assumed that this difference was more likely explained
246 by a large number of false positive orthology annotations than an actual genome-scale
247 difference in the redundancies between rat and human metabolic enzymes. Alternatively,
248 requiring orthologs to be annotated in all 5 databases generated much smaller rat GPR rules for
249 shared reactions and introduced a large number of human-specific reactions that would

250 substantially reduce the functionality of *iRno* (top row of panels in **Supplementary Fig. 3**). We
251 found a balanced relationship between the numbers of reactions with larger rat GPR rules than
252 human and numbers of reactions with larger human GPR rules than rat by removing orthology
253 annotations found in only one database and restricting the replacement of each human gene to
254 two rat orthologs (selected cutoff panel in **Supplementary Fig. 3**). Additionally, the selected
255 cutoff preserved the same functionalities as the relaxed cutoff when evaluating metabolic tasks
256 from HMR2³. This filtering step was important because methods that integrate gene expression
257 data or simulate the impact of genomic alterations rely heavily on the number of redundant
258 enzymes associated with a reaction^{5,6}.

259

260 **Identifying species-specific reactions**

261 We initially explored the Kyoto Encyclopedia for Genes and Genomes^{7,8} (KEGG) database as a
262 starting point for identifying species-specific differences between rat and human metabolism.
263 Prior to adding potential new reactions to *iRno* and *iHsa*, existing reactions and metabolites
264 were updated with annotations to external databases. Throughout the entire reconstruction
265 process, 742 reactions and 354 metabolites were assigned new or updated KEGG annotations
266 to replace empty, incorrect, generic, or obsolete KEGG identifiers. The numbers of unique
267 KEGG REACTION and KEGG COMPOUND identifiers represented across *iRno* and *iHsa*
268 increased from 1376 and 1650 to 1702 and 1721, respectively, compared to HMR2
269 **(Supplementary Data 3)**.

270

271 Updated annotations were necessary to avoid creating duplicate entries of unique reactions or
272 metabolites and to facilitate assigning GPR rules to 122 reactions not previously associated with
273 any genes. For example, the metabolic reaction catalyzing the conversion of threonine to
274 glycine and acetaldehyde was originally present in HMR2 as a spontaneous (non-enzymatic)
275 reaction with no external annotations³. This reaction was identified in the KEGG database as the

276 rat-specific reaction, threonine aldolase (R00751). As a result, this reaction was assigned a new
277 GPR rule in *iRno* and disabled in *iHsa*. Of 18 rat-specific KEGG reaction annotations: 5 were
278 already represented and removed from *iHsa*; 11 were added as new rat-specific reactions *iRno*;
279 and 2 redundant with other rat-specific reactions were ignored (**Supplementary Data 8**). Of 75
280 human-specific KEGG annotations: 4 were already represented in *iHsa*, and had been disabled
281 in *iRno* as a result of the GPR conversion process; 14 were re-classified as shared reactions
282 after identifying suitable rat orthologs; and 57 involved in peripheral pathways such as
283 xenobiotic metabolism were ignored (**Supplementary Data 8**).

284
285 *iRno* and *iHsa* were expanded and updated in parallel when possible to maintain consistency in
286 the reconstruction process. For each new reaction added, rat and human GPR rules were
287 constructed manually using evidence from experimental literature and functional annotation
288 databases (**Supplementary Data 1**). Evidence supporting the presence of a reaction in one
289 organism and not the other was necessary for classifying a reaction as species-specific.
290 Otherwise, reactions directly associated with rat and human enzymes or indirectly through
291 orthology annotations were assumed to be shared. In total, 69 biochemical, 32 transport, 40
292 exchange reactions were added. All transport and exchange reactions were shared by *iRno* and
293 *iHsa* and nine biochemical reactions were unique to *iRno*.

294
295 *iRno* and *iHsa* were expanded to include species-specific reactions from the KEGG database
296 and literature sources. Lists of reactions and modules linked to genes annotated in humans
297 (*hsa*) and rats (*rno*) were obtained using KEGG's Representational state transfer (REST)-style
298 interface (<http://www.kegg.jp/kegg/rest/keggapi.html>). Reactions linked to humans and not rats
299 or to rats and not humans were manually investigated for their feasibility as actual species-
300 specific reactions. To identify potential differences between the metabolic capabilities of rats
301 and humans from literature, various searches were performed using PubMed

302 (<http://www.ncbi.nlm.nih.gov/pubmed>) with combinations of the keywords: rat, human,
303 comparative genomics, cross-species, species-specific, metabolism, metabolic deficiency. No
304 comprehensive comparative analyses were identified other than original publication of the rat
305 genome⁹.

306

307 **Curating GPR rules to include complex relationships**

308 GPR rules comprised of more than one gene were initially limited to isozymic “or” relationships
309 because none of the 1390 unique GPR rules in HMR2 described relationships between subunits
310 in a protein complex³. To overcome this limitation, GPR rules were manually constructed to
311 include “and” logical operators for both rat and human models when possible. Evidence
312 supporting the requirement of multiple enzymatic subunits to perform a metabolic function were
313 obtained from functional annotation databases and experimental literature (**Supplementary**
314 **Data 1**). We also compared complex human GPR rules from the second largest human
315 GENRE, *Homo sapiens* Recon 2 (versions 2.0.3 and 2.0.4), with an early draft of *iHsa* in order
316 to convert isozymic relationships into complex relationships.

317

318 **Formatting complex GPR rules for TIMBR**

319 For gene expression integration using TIMBR (Transcriptionally-Inferred Metabolic Biomarker
320 Response), GPR rules involving redundant subunits in a protein complex were structured
321 according to the following format: (*A1* or *A2*) and (*B1* or *B2*), where redundant enzymes are
322 grouped together for each subunit. With this GPR format, a TIMBR weight represents an
323 average change in gene expression for the subunit that experienced the largest perturbation.
324 Because TIMBR summarizes directional changes instead of absolute values, the following
325 alternative Boolean representation could yield different results: (*A1* and *B1*) or (*A1* and *B2*) or
326 (*A2* and *B1*) or (*A2* and *B2*), where non-redundant subunits are grouped together for each
327 possible protein complex. With this alternative representation, a reaction weight would represent

328 an average of the largest gene expression changes observed for each possible protein
329 complex. Although both approaches are conceptually similar, TIMBR implements the former
330 approach that summarizes gene expression changes independently for each subunit.

331

332 **Recapitulating biological functions with metabolic tasks**

333 Curated rat and human models successfully performed all 327 tasks (**Supplementary Data 4**).
334 Removal of reactions from *iHsa* as part of the reconciliation process did not affect the
335 completion of any metabolic tasks. Furthermore, the addition of new reactions to *iRno* and *iHsa*
336 did not enable completion of 19 tasks explicitly intended to fail such as the *de novo* synthesis of
337 essential amino. An important advantage of *iHsa* (and *iRno*) is that one unit of glucose
338 regenerates 25.6 units of ATP with an unlimited supply of oxygen and 2 units of ATP in the
339 absence of oxygen. Several new tasks were added that tested whether *iRno* and *iHsa* could use
340 thermodynamically infeasible loops to regenerate ATP from ADP without a carbon-based
341 energy or “fuel” source like glucose.

342

343 The presence or absence of all KEGG MODULEs were queried for rats and humans, revealing
344 2 human-specific modules and 1 rat-specific module. Each module described the ability of an
345 organism to synthesize a product *de novo* from a starting substrate, as reported above for the
346 rat-specific module M00129 where vitamin C can be synthesized from glucose. In KEGG, the
347 human-specific modules for chenodeoxycholic acid synthesis from cholesterol and degradation
348 of heparan sulfate into disaccharides were each characterized by a single missing enzyme in
349 rats. For chenodeoxycholic acid synthesis, the blocked reaction, 3-alpha-hydroxysteroid
350 dehydrogenase (EC 1.1.1.50) was not annotated for any rat enzymes. Upon review of
351 experimental literature, the rat gene, *Akr1c14*, was reported to demonstrate this activity¹⁰,
352 suggesting that this module be reclassified as complete in both rats and humans. For heparan

353 sulfate degradation, manually assigning the rat enzyme, *Hgsnat*, to its known function (EC
354 2.3.1.78) was able to recapitulate this previously annotated human-specific function in rats¹¹.

355

356 **Capturing the importance of L-gulonolactone oxidase in vitamin C synthesis**

357 L-gulonolactone oxidase (*Gulo*) has been described as the critical enzyme for vitamin C
358 synthesis that differentiates rats from humans¹² (**Supplementary Fig. 4a**). Using flux variability
359 analysis (FVA)¹³, 10 reactions were required by *iRno* to synthesize vitamin C under glucose
360 minimal media conditions. Only one enzymatic reaction required for vitamin C synthesis in *iRno*
361 that was also absent in *iHsa* was L-gulonolactone oxidase (EC 1.1.3.8) (**Supplementary Fig.**
362 **4b**). In agreement with the KEGG MODULE, “ascorbate biosynthesis, animals” (M00129), L-
363 gulonolactone oxidase (K00103) was annotated as the only enzymatic step missing in humans
364 (**Supplementary Fig. 4c**). Additionally, deleting *Gulo* blocked the ability of *iRno* to produce
365 vitamin C, consistent with a *Gulo*-deficient strain of rat developed to study scurvy¹⁴. Artificially
366 adding L-gulonolactone oxidase to *iHsa* would enable the human model to successfully
367 complete the vitamin C synthesis task (**Supplementary Fig. 4d**), as previously described in a
368 study that restored vitamin C synthesis in a human cell line using the murine ortholog of *Gulo*¹⁵.

369

370 Vitamin C consumption was required for biomass synthesis in *iHsa* but not in *iRno*. The
371 functional impact of vitamin C deficiency on cellular growth was simulated by constraining the
372 uptake of the vitamin C exchange reaction to 1 fmol cell⁻¹ hour⁻¹ (physiological consumption
373 rate¹⁶) or 0 (vitamin C deficiency) (**Supplementary Data 4**). The maximum theoretical flux
374 through the biomass reaction of each model, containing equimolar amounts of vitamin C per cell
375 (0.06 fmol cell⁻¹), was measured *in silico* using flux balance analysis¹⁷. When the uptake rate of
376 vitamin C was decreased below 25% of normal physiological rates, the maximum possible
377 growth rate was reduced exclusively in *iHsa* and not in *iRno*. Despite this distinction, limiting the
378 uptake of vitamin C within an order of magnitude of the physiological uptake rate had no effect

379 on growth, suggesting that vitamin C is not likely a growth rate-limiting factor under normal
380 conditions in either organism.

381

382 **Defining physiological conditions and biomass compositions for human and rat** 383 **hepatocytes**

384 A novel system of reactions representing biomass synthesis was developed to enable cross-
385 species predictions of growth between *iRno* and *iHsa* (**Supplementary Fig. 6**). New biomass
386 metabolites were defined for each macromolecular subcomponent present in a hepatocyte
387 including (percent of dry weight): DNA (2.3%), RNA (3.7%), lipids (17%), protein-incorporated
388 amino acids (59%), free amino acids (3.7%), bile acids (.1%), and miscellaneous metabolites
389 (11%) (**Supplementary Fig. 6a**). Miscellaneous metabolites included vitamins, and cofactors,
390 and other metabolites present at high intracellular concentrations such as vitamin C, citrate, and
391 glutathione. The relative abundances of individual metabolites within each subgroup were
392 determined from several previously published studies^{16,18-32}. Data directly comparing metabolite
393 profiles between human and rat hepatocytes were available for amino acids and bile acids. To
394 account for these differences within a generalized framework, species-specific reactions were
395 added to *iRno* and *iHsa* for the synthesis of these two biomass metabolites (**Supplementary**
396 **Fig. 6b**). For biomass components with similar compositions between rats and humans, shared
397 reactions were used to produce estimated hepatocyte-specific compositions (**Supplementary**
398 **Fig. 6c**). This new cross-species framework can be extended to formulate new biomass
399 compositions for cross-species analyses within and between various cell or tissue types using
400 the same centralized biomass precursor metabolites.

401

402 Physiological ranges for exchange reactions were determined using a consensus approach
403 (**Supplementary Fig. 7**). Experimentally measured metabolite consumption and secretion rates
404 were obtained for rat liver cells and rat hepatocytes from 6 existing studies^{3,33-38}. Exchange

405 reaction equations were formulated such that negative and positive fluxes represented
406 consumption and secretion, respectively. Flux measurements were standardized to units of fmol
407 cell⁻¹ hour⁻¹ using previously described conversion rates³⁹. In order to normalize quantitative
408 measurements from different experimental systems, absolute flux measurements were median-
409 scaled using metabolites measured in all 6 experiments to the average median value of the 3 *in*
410 *vitro* experiments. To assign experimental observations as physiological constraints, lower and
411 upper bounds for exchange reactions were determined based on minimum and maximum
412 normalized values across all experimental observations.

413
414 Physiological constraints were applied to *iRno* and *iHsa* as either relaxed constraints for
415 treatment-induced biomarker predictions (**Supplementary Fig. 7a**) or strict constraints for
416 quantitative simulations of hepatocyte biomass (**Supplementary Fig. 7b**). Under relaxed and
417 strict physiological constraints, lower bound values less than zero were used to allow nutrient
418 uptake of measured metabolites (**Supplementary Fig. 7a**). Under strict physiological
419 constraints, lower bound values greater than zero were also applied requiring secretion of urea,
420 glucose, glutamate, aspartate, 3-hydroxybutyrate, and albumin. Upper bound values were also
421 applied to require consumption or limit secretion of metabolites under strict physiological
422 constraints (**Supplementary Fig. 7b**). Additionally, estimated uptake rates for 12 inorganic ions
423 (**Supplementary Fig. 7d**) and 13 essential nutrients (**Supplementary Fig. 7e**) were assigned
424 under both relaxed and strict physiological constraints. For metabolites with flux measurements
425 available in rat and human hepatocytes, differences between species were considered
426 negligible relative to feasible flux ranges with the exception of bile acids.

427
428 Under strict physiological conditions, species-specific constraints were formulated for the export
429 of bile salts by hepatocytes (**Supplementary Fig. 7c**). In addition to the unique ability of rats to
430 synthesize muricholic acids, the relative abundances of bile acids differed significantly in a

431 recent study that compared serum bile acid profiles of rats and humans³³. Rat-specific and
432 human-specific reactions were defined to produce an average bile salt measured for each
433 organism, similar to species-specific reactions formulated for biomass synthesis. Under strict
434 physiological conditions, a minimum flux of 0.4 fmol cell⁻¹ hour⁻¹ was required through a unified
435 exchange reaction representing average bile salt production.

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