Microbiome contributions to drug metabolism

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The team







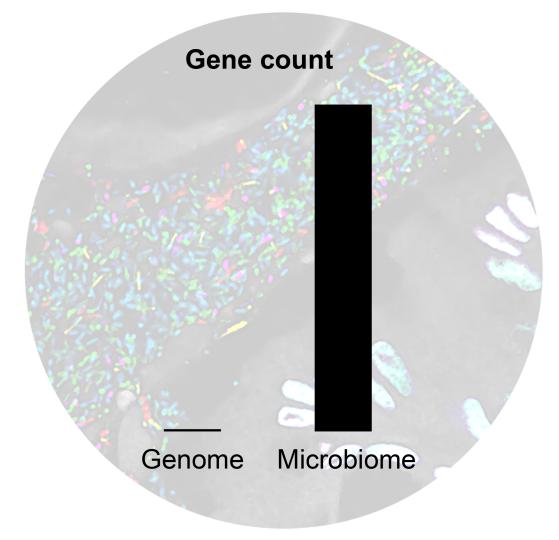
The team





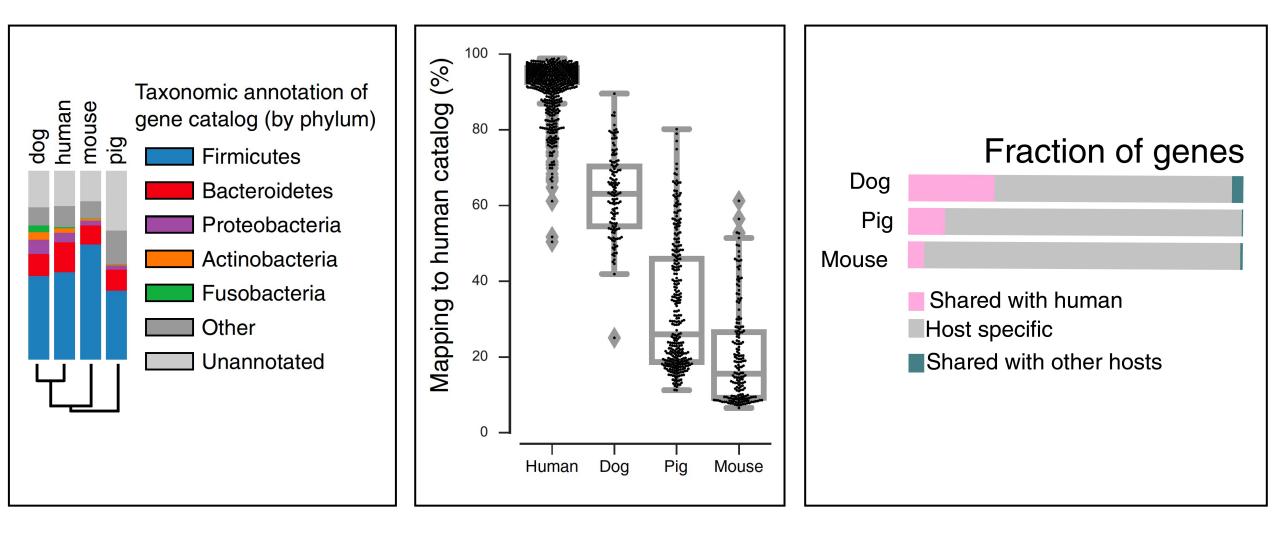


The microbiome is acquired from the environment and can dramatically change gene content over time



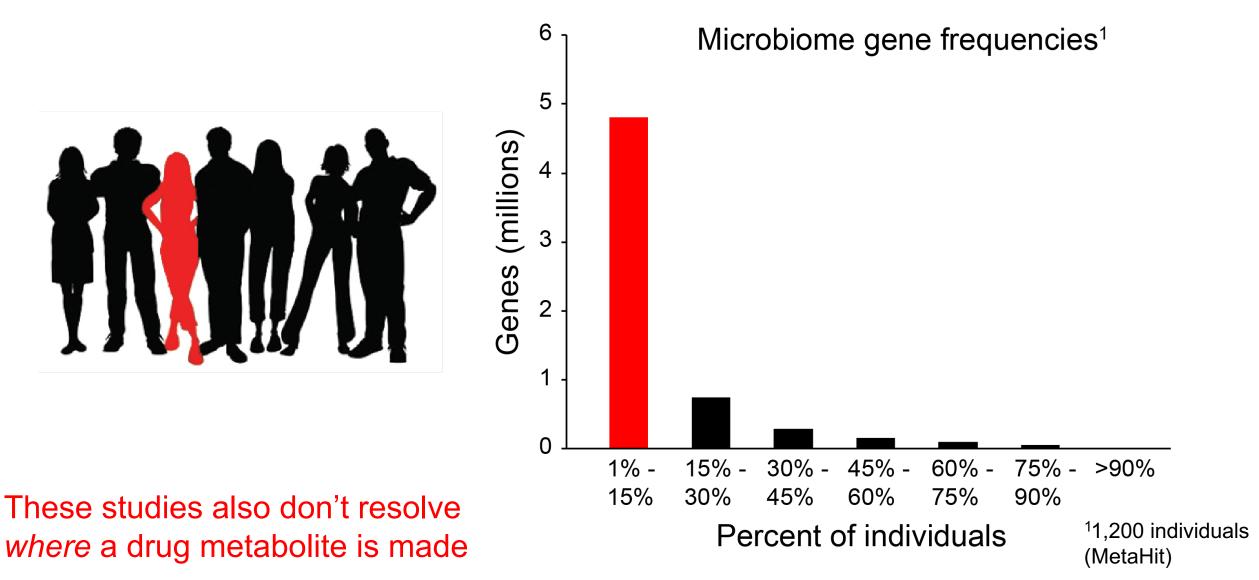
- Possibly the most therapeutically tractable organ in the body
- Possibly the least understood

Typical preclinical animal studies are not designed to measure microbiome impact on drug metabolism

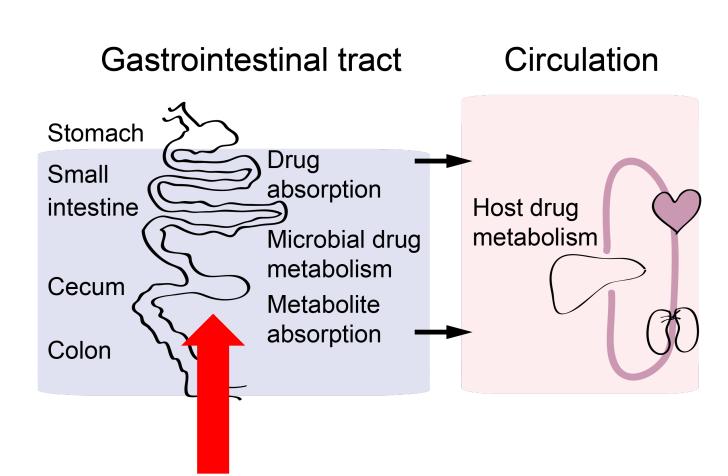


Coelho et al, *Microbiome* 2018

Human mass balance studies are also not designed to capture microbiome impacts



Anecdotal examples of microbiome-mediated drug metabolism



Drug Modifications Alkene reduction Sulfoxide reduction N-oxide reduction Azoreduction Nitroreduction Demethylation Dehydroxylation Acetylation Deacetylation Decarboxylation Deglucuronidation Hydrolysis Ring opening

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Drug Indications

Cancer

Cardiovascular disease

Mental health

IBD

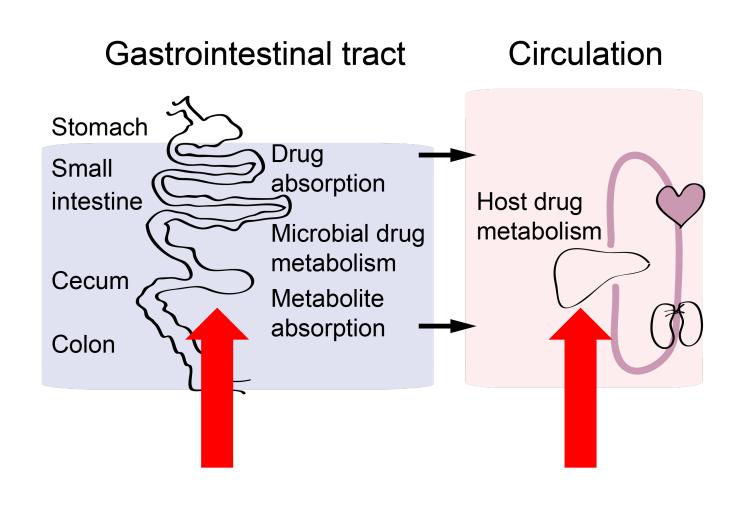
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Infectious disease

Parkinson's disease

Organ transplant

Drug metabolites produced by both liver and microbiome are challenging to identify



Site of metabolism will determine the impact of:

Genetic variation
 (host and microbiome)

Diet

- Liver and gut health
- Disease state
- Other drugs

How can we understand microbiome contributions to drug metabolism?

1. An outline of drug metabolism by human gut microbes and their genes

How can we understand microbiome contributions to drug metabolism?

1. An outline of drug metabolism by human gut microbes and their genes

2. Resolving host and microbiome contributions to shared drug metabolites

An outline of drug metabolism by human gut microbes and their genes

Are there rules that dictate whether and how a gut microbe will metabolize a drug?

Do gut microbes encode enzymes that metabolize many drugs?

We can begin to explore these questions by asking how a large number of drugs are metabolized by a large number of microbes

271 FDA-approved, oral drugs

ABACAVIR	BUDESONIDE	DEFLAZACORT	EZETIMIBE	LAMOTRIGINE	MILNACIPRAN	PAROXETINE	REPAGLINIDE	TERAZOSIN
ACEBUTOLOL	BUPROPION	DESVENLAFAXINE	FAMCICLOVIR	LETROZOLE	MYCOPHENOLATE	PENBUTOLOL	RESERPINE	TERBINAFINE
ACECAINIDE	BURAMATE	DEXAMETHASONE	FAMPROFAZONE	LEVAMISOLE	NADOLOL	PENTOXIFYLLINE	RILUZOLE	THIABENDAZOLE
ALFUZOSIN	BUSPIRONE	DEXTROMETHORPHAN	FEBUXOSTAT	LEVONORGESTREL	NAFRONYL OXALATE	PERGOLIDE	RIMANTADINE	THIOTHIXENE
ALMOTRIPTAN	CAMYLOFINE	DIACETAMATE	FENOFIBRATE	LINAGLIPTIN	NAFTOPIDIL	PERICIAZINE	RISPERIDONE	TIAPRIDE
ALPRENOLOL	CAPECITABINE	DICYCLOMINE	FENSPIRIDE	LOFEXIDINE	NALOXONE	PERINDOPRIL	RITONAVIR	TIMOLOL
AMANTADINE	CARBETAPENTANE	DIFLORASONE	FEXOFENADINE	LOPERAMIDE	NAPROXEN(+)	PHENACETIN	RIVASTIGMINE	TINIDAZOLE
AMINOGLUTETHIMIDE	CARBINOXAMINE	DIGITOXIN	FINASTERIDE	LOSARTAN	NATEGLINIDE	PHENAZOPYRIDINE	RIZATRIPTAN	TOLAZAMIDE
AMISULPRIDE	CARISOPRODOL	DIGOXIN	FLUCONAZOLE	LOVASTATIN	NEFAZODONE	PHENYTOIN	ROPINIROLE	TOPOTECAN
ANAGRELIDE	CARVEDILOL	DILTIAZEM	FLUOXETINE	LOXAPINE	NEFOPAM	PIDOTIMOD	ROSIGLITAZONE	TRANDOLAPRIL
ANASTROZOLE	CELECOXIB	DIPERODON	FLUPHENAZINE	MEBENDAZOLE	NEOSTIGMINE	PIMOZIDE	ROSUVASTATIN	TRANILAST
ANTAZOLINE	CETIRIZINE	DIPHENYLPYRALINE	FLUVOXAMINE	MEBHYDROLIN	NEVIRAPINE	PITAVASTATIN	ROXATIDINE	TRAZODONE
APOMORPHINE	CHLORMEZANONE	DIPYRIDAMOLE	GALANTAMINE	MEFLOQUINE	NICERGOLINE	PRANOPROFEN	SERTRALINE	TRIHEXYPHENIDYL
ARTEMISININ	CIMETIDINE	DISOPYRAMIDE	GLICLAZIDE	MEGESTROL	NITRENDIPINE	PRAZOSIN	SILDENAFIL	TRIMEBUTINE
ATENOLOL	CITALOPRAM	DOMPERIDONE	GLIPIZIDE	MELPHALAN	NIZATIDINE	PREDNISONE	SOLIFENACIN	TRIMETAZIDINE
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BENAZEPRIL	CLIDINIUM	DROSPIRENONE	HYOSCYAMINE	METHOXSALEN	OLANZAPINE	PROMETHAZINE	SULFINPYRAZONE	TROPISETRON
BENZBROMARONE	CLONIDINE	DULOXETINE	IDEBENONE	METHSUXIMIDE	OLMESARTAN	PYRIMETHAMINE	SULINDAC	TROSPIUM
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BEZAFIBRATE	CYCLOPHOSPHAMIDE	ERGOTAMINE	IRSOGLADINE	METOCLOPRAMIDE	OXETHAZAINE	RACECADOTRIL	TADALAFIL	VINPOCETINE
BICALUTAMIDE	CYPROTERONE	ESZOPICLONE	ISRADIPINE	METOLAZONE	OXYBUTYNIN	RAMELTEON	TAMSULOSIN	VORICONAZOLE
BIPERIDEN	DABIGATRAN	ETHOPROPAZINE	ITRACONAZOLE	METOPROLOL	PACLITAXEL	RAMIPRIL	TEGASEROD	WARFARIN
BISACODYL	DANAZOL	ETHOXZOLAMIDE	KETOROLAC	MEVASTATIN	PALIPERIDONE	RANITIDINE	TELMISARTAN	ZALEPLON
BISOPROLOL FUMARATE	DARIFENACIN	ETHYNODIOL	KETOTIFEN	MIANSERIN	PANTOPRAZOLE	RANOLAZINE	TENATOPRAZOLE	ZIDOVUDINE
BROMOCRIPTINE	DASATINIB	ETODOLAC	LABETALOL	MIFEPRISTONE	PAPAVERINE	REBAMIPIDE	TENOXICAM	ZIPRASIDONE

76 genome-sequenced human gut bacterial isolates

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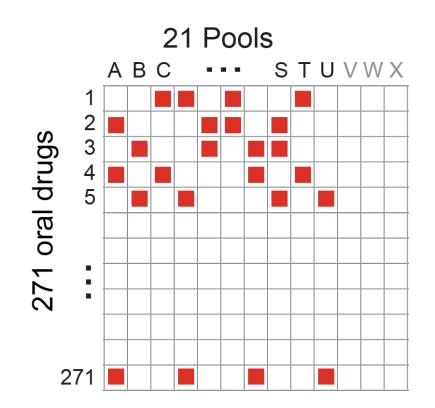
Bacteroides coprophilus DSM 18228 Bacteroides pectinophilus ATCC 43243 Bacteroides uniformis ATCC 8492 Bacteroides dorei DSM 17855 Bacteroides vulgatus ATCC 8482 Bacteroides xylanisolvens DSM 18836 Bacteroides fragilis HMW610 Bacteroides fragilis ATCC 43859 Bacteroides fragilis HMW615 Bacteroides fragilis DS-208 Bacteroides fragilis T(B)9 Bacteroides fragilis NCTC 9343 Odoribacter splanchnicus Parabacteroides distasonis ATCC 8503 Prevotella copri DSM 18205 Alistipes indistinctus DSM 22520 Bacteroides finegoldii DSM 17565 Bacteroides intestinalis DSM 17393 Bacteroides cellulosilyticus DSM 14838 Bacteroides WH2 Parabacteroides merdae ATCC 43184 Parabacteroides iohnsonii DSM 18315 Bacteroides thetaiotaomicron 3731 Bacteroides thetaiotaomicron VPI-5482 Bacteroides thetaiotaomicron 7330 Bacteroides ovatus ATCC 8483 Bacteroides stercoris ATCC 43183 Bacteroides fragilis 3397 T10 Bacteroides eggerthii DSM 20697 Bacteroides caccae ATCC 43185 Escherichia coli K12 Proteus penneri ATCC 35198 Enterobacter cancerogenus ATCC 353 Edwardsiella tarda ATCC 23685 Providencia rettgeri DSM 1131 Providencia alcalifaciens DSM 30120 Providencia stuartii ATCC 25827 Salmonella typhimurium LT2

Ruminococcus gnavus ATCC 29149 Clostridium hathewayi DSM 13479 Marvinbrvantia formatexigens DSM 14469 Eubacterium ventriosum ATCC 27560 Clostridium ramosum DSM 1402 Clostridium spiroforme DSM 1552 Dorea formicigenerans ATCC 27755 Clostridium bolteae ATCC BAA-613 Anaerostipes sp. Ruminococcus lactaris ATCC 29176 Clostridium symbiosum ATCC 14940 Anaerotruncus colihominis DSM 17241 Anaerococcus hydrogenalis DSM 7454 Coprococcus comes ATCC 27758 Eubacterium rectale ATCC 33656 Subdoligranulum variabile DSM 15176 Blautia Iuti DSM 14534 Roseburia intestinalis L1-82 Eubacterium hallii DSM 3353 Clostridium asparagiforme DSM 15981 Clostridium scindens ATCC 35704 Enterococcus faecalis V583 Clostridium difficile 120 Clostridium sporogenes ATCC 15579 Eubacterium biforme DSM 3989 Clostridium nexile DSM 1787 Blautia hansenii DSM 20583 Ruminococcus torques ATCC 27756 Lactobacillus reuteri CF48-3A Collinsella aerofaciens ATCC 25986 Collinsella intestinalis DSM 13280 Bifidobacterium breve DSM 20213 Bifidobacterium adolescentis ATCC15 Bifidobacterium longum s. infantis Bifidobacterium ruminantium Eggerthella lenta ATCC 25559 Akkermansia muciniphila ATCC BAA-8 Victivallis vadensis ATCC BAA-548

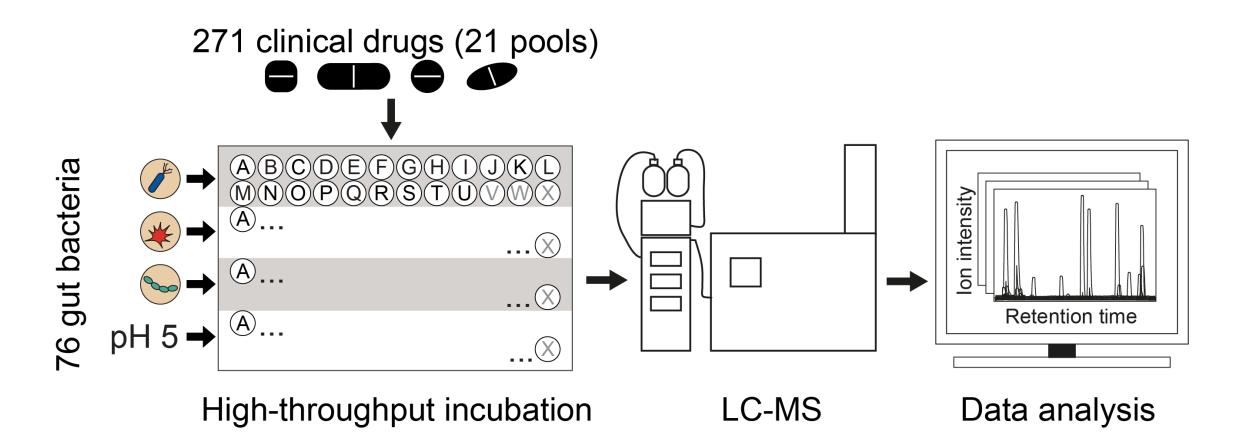
271 drugs, 76 bacterial strains, 2 timepoints, 4 replicates = 164,768 measurements

We assigned each drug to a subset of pools according to two simple rules

- Each drug is placed in 4 pools
- Any two drugs share at most
 2 of their 4 assigned pools

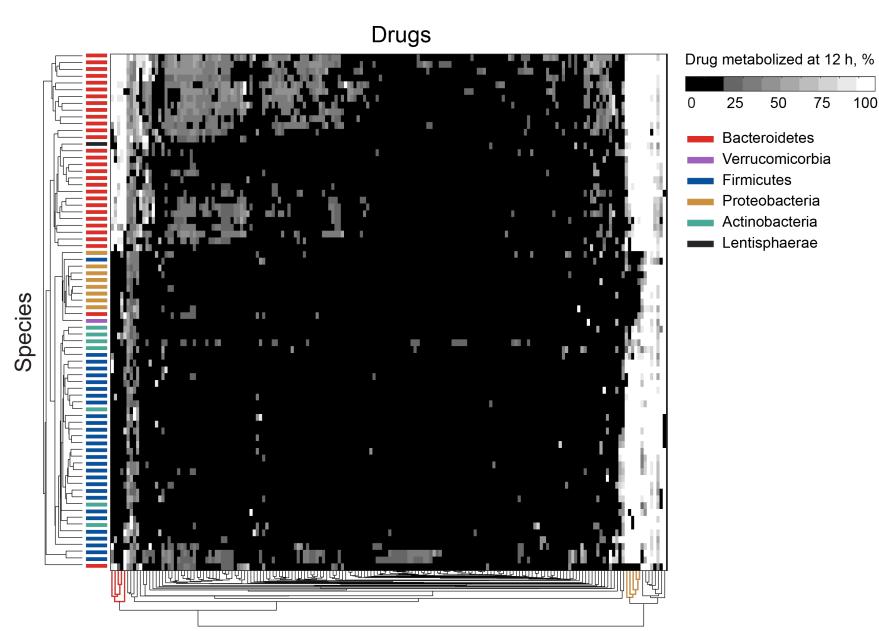


High-throughput measurement of drug metabolism by LC-MS

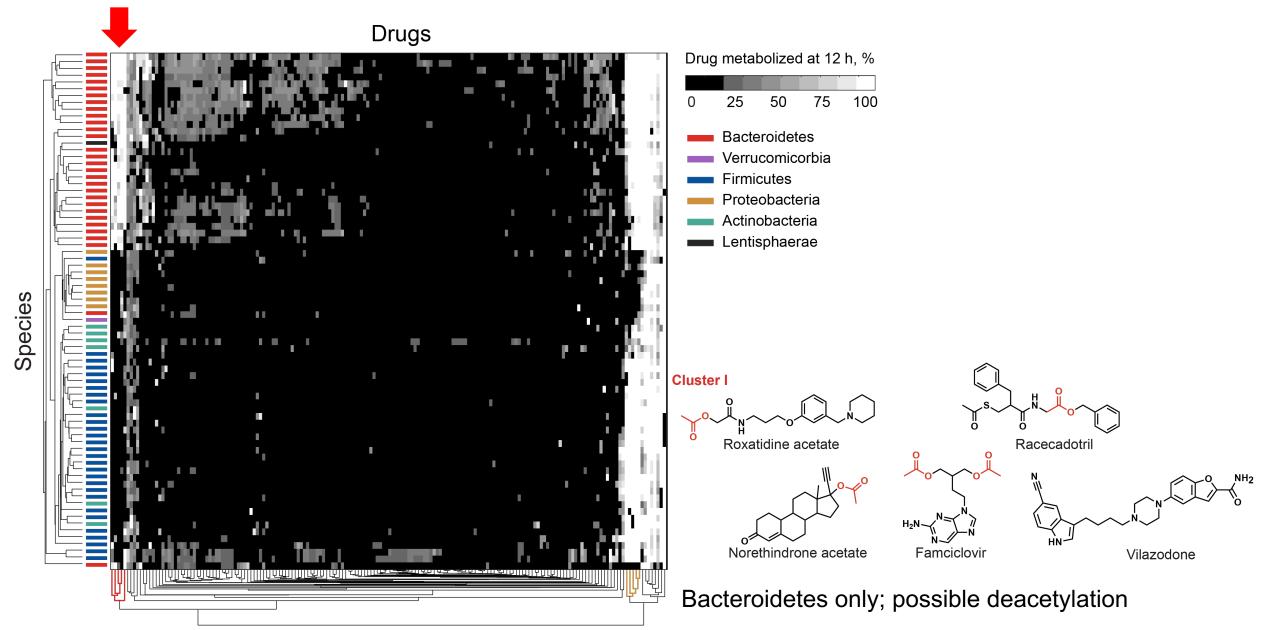


164,768 measurements from 19 96-well plates

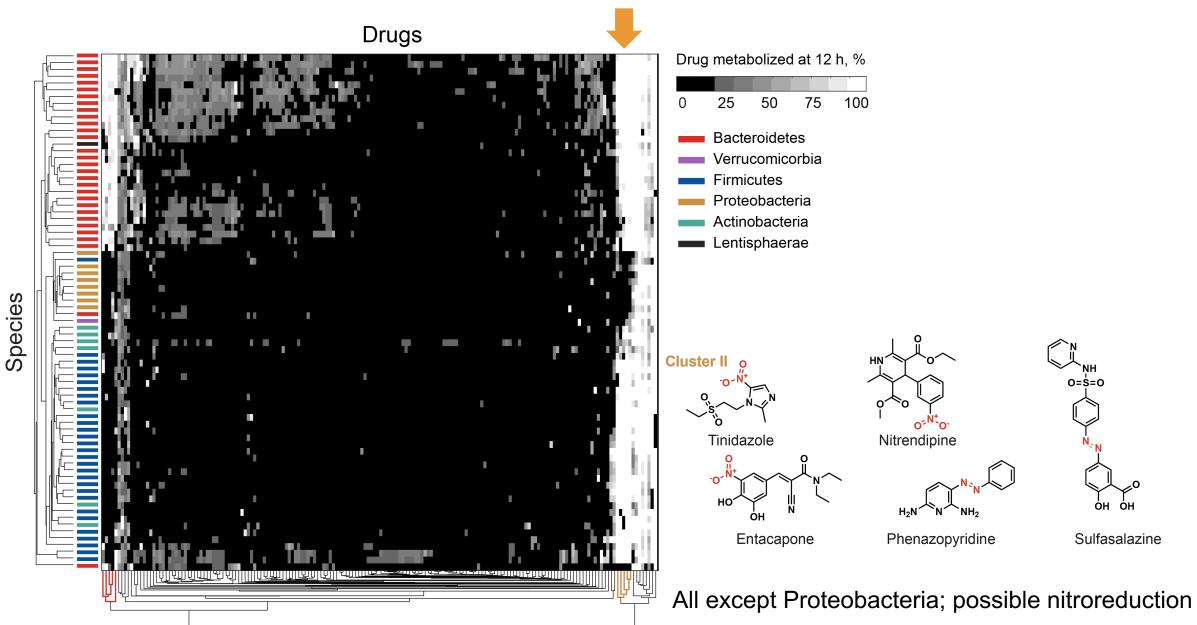
Related gut bacteria metabolize similar subsets of drugs



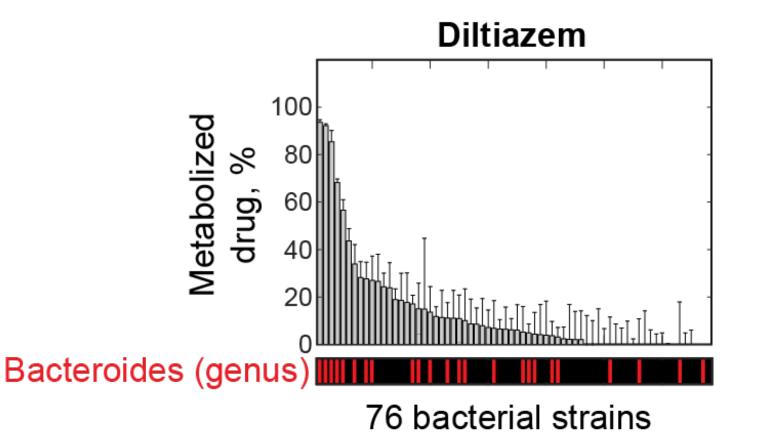
Some drugs with shared features cluster together



Some drugs with shared features cluster together



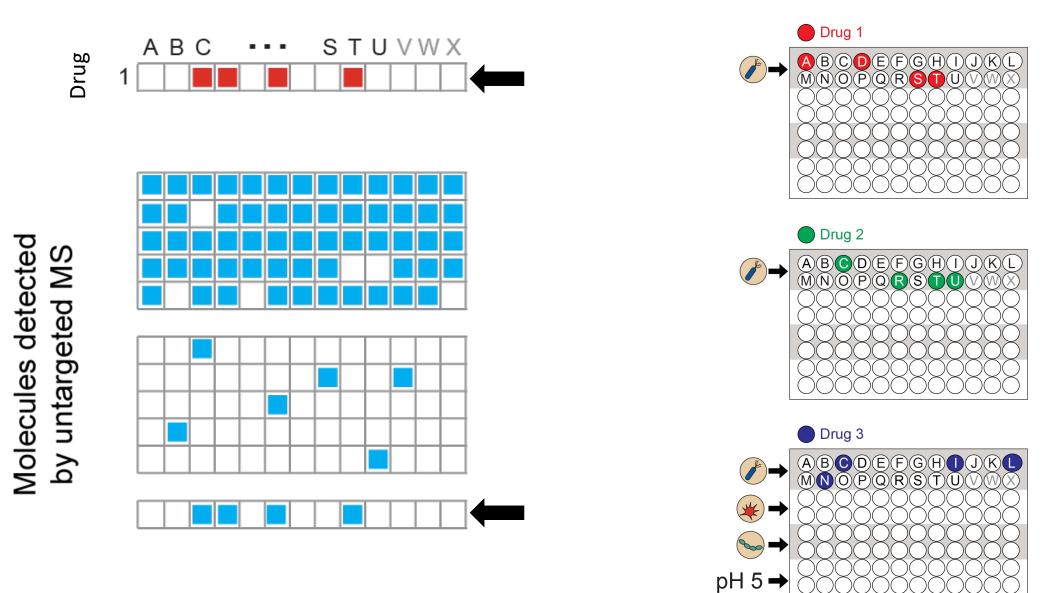
In many cases, genus (or species) identity does not predict drug-metabolizing activity



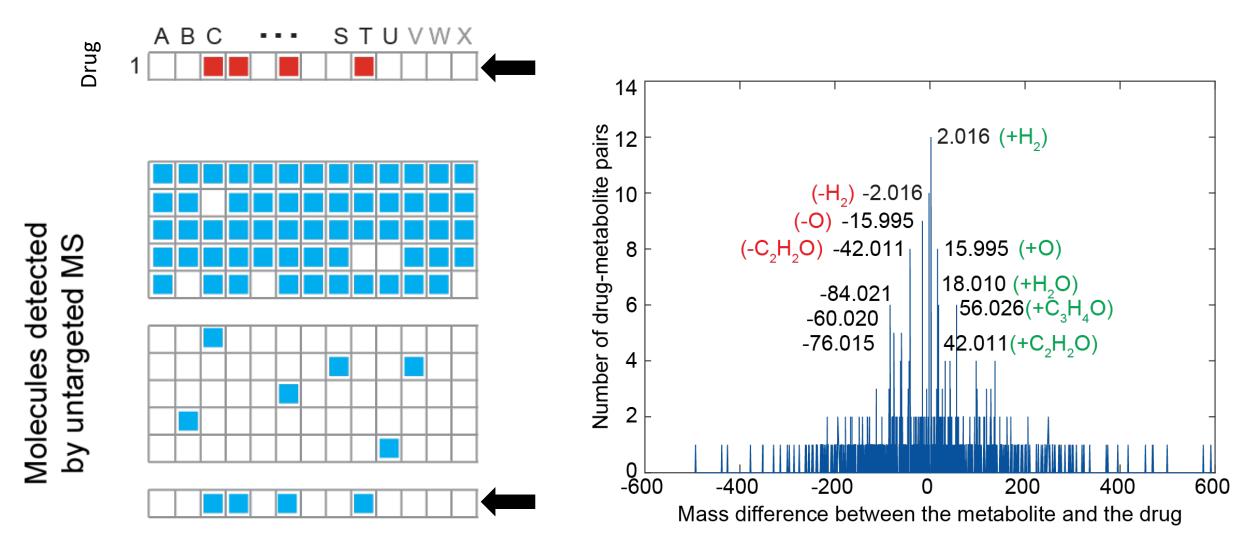
• What drug metabolites are formed?

anti-hypertension

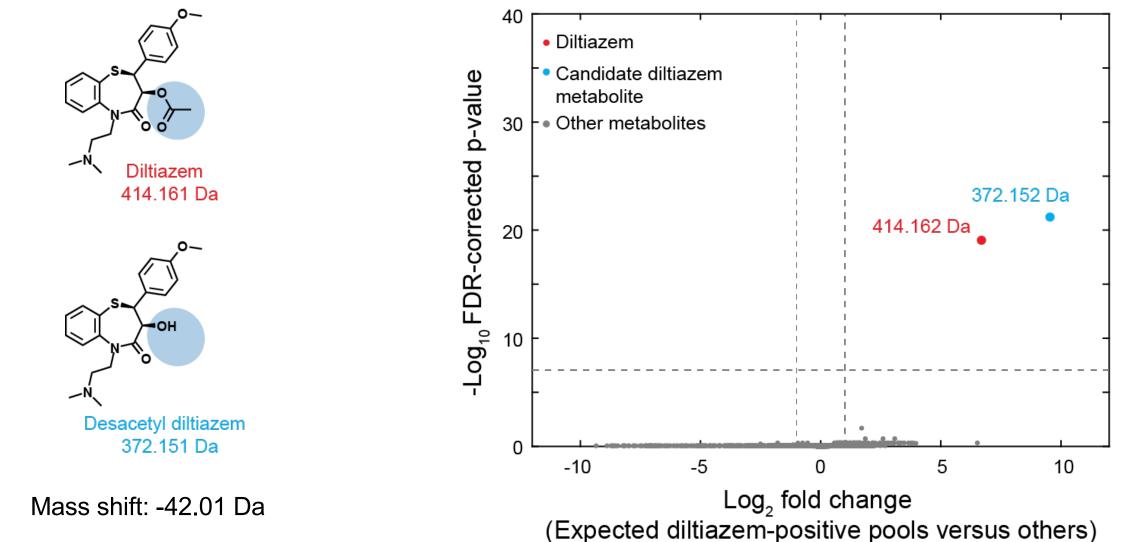
Identification of candidate drug metabolites by untargeted MS



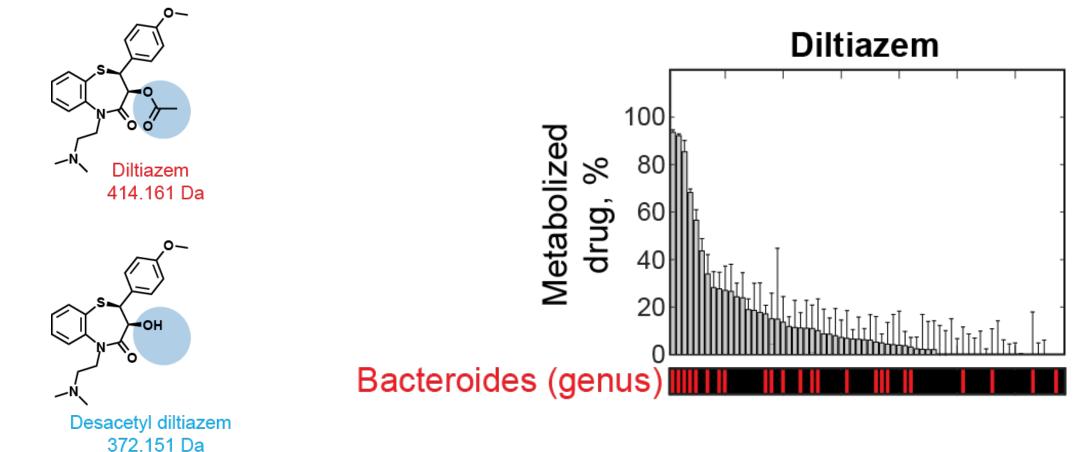
Gut microbes carry out the same modifications on multiple drugs



Two compounds are specifically present in diltiazem-containing pools



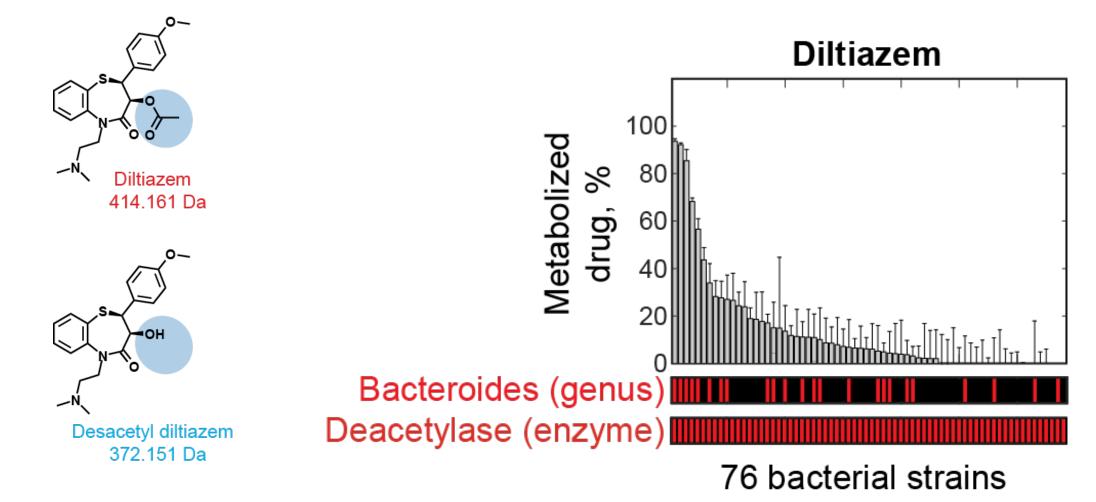
Even simple drug modifications can be restricted to select bacteria



76 bacterial strains

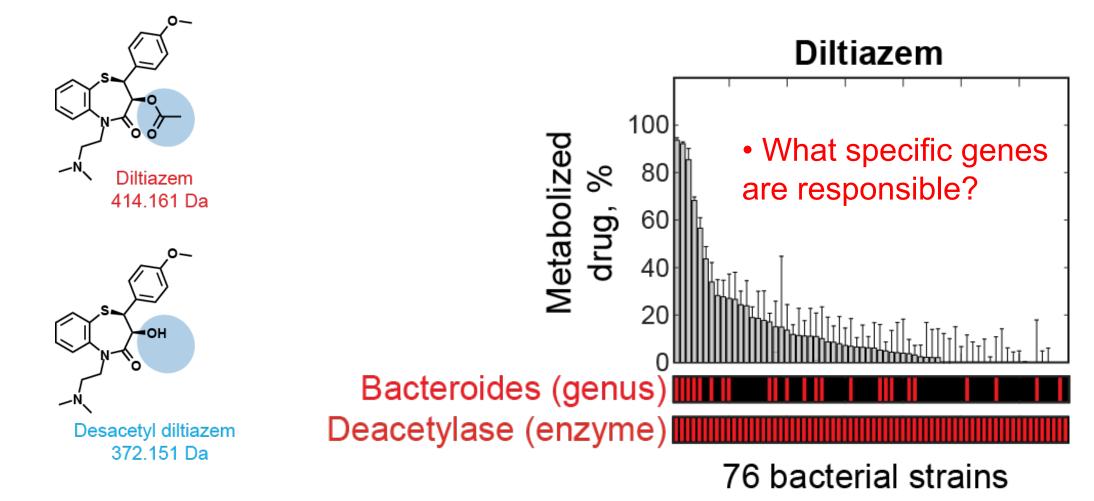
Mass shift: -42.01 Da

Genome annotation does not predict drug metabolism activity



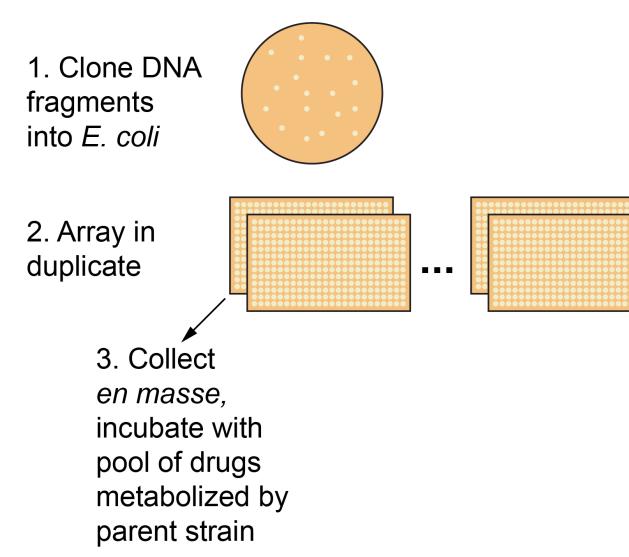
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Genome annotation does not predict drug metabolism activity

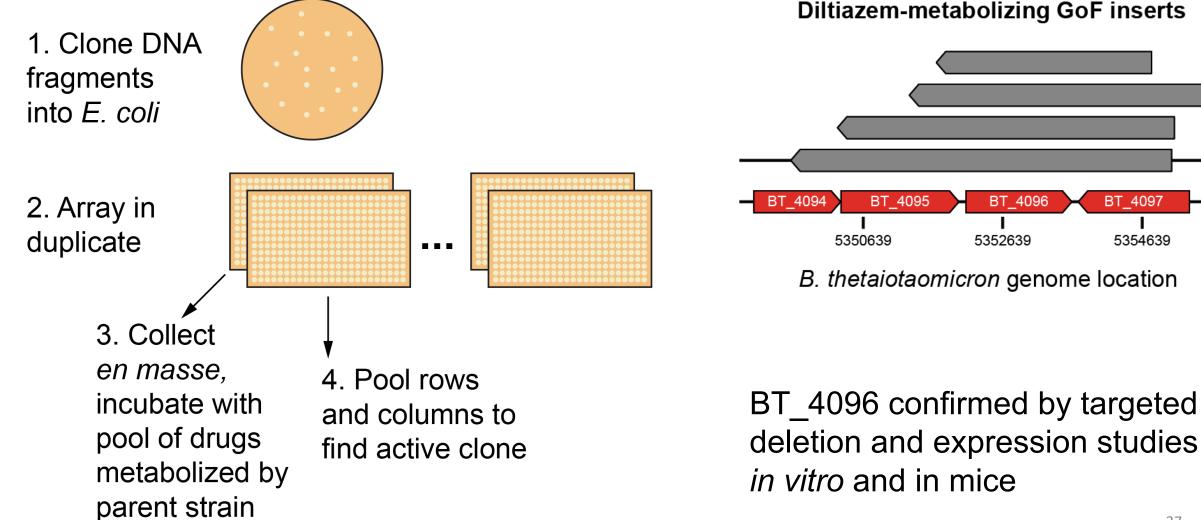


Mass shift: -42.01 Da

A gain-of-function strategy for identifying drug metabolizing enzymes



A gain-of-function strategy for identifying drug metabolizing enzymes

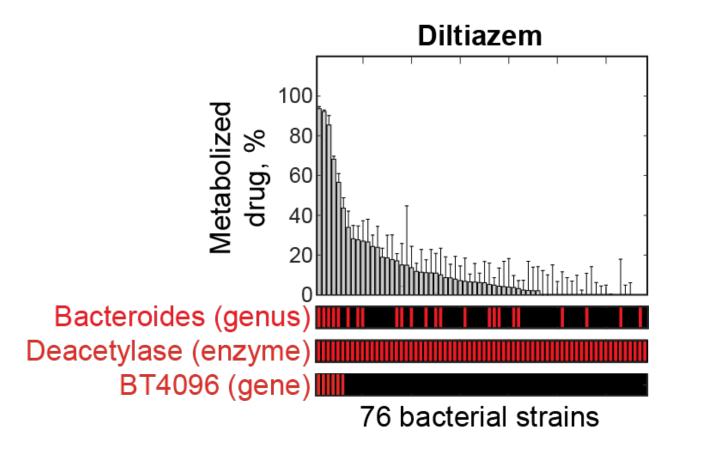


Diltiazem-metabolizing GoF inserts

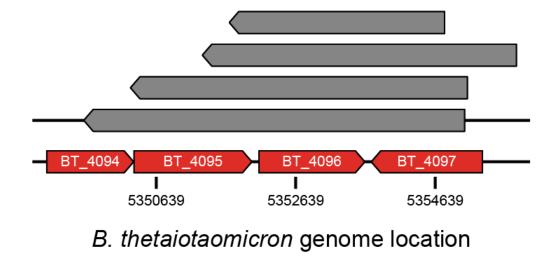
BT_4097

5354639

Identified genes can explain drug-metabolizing activity across human gut species

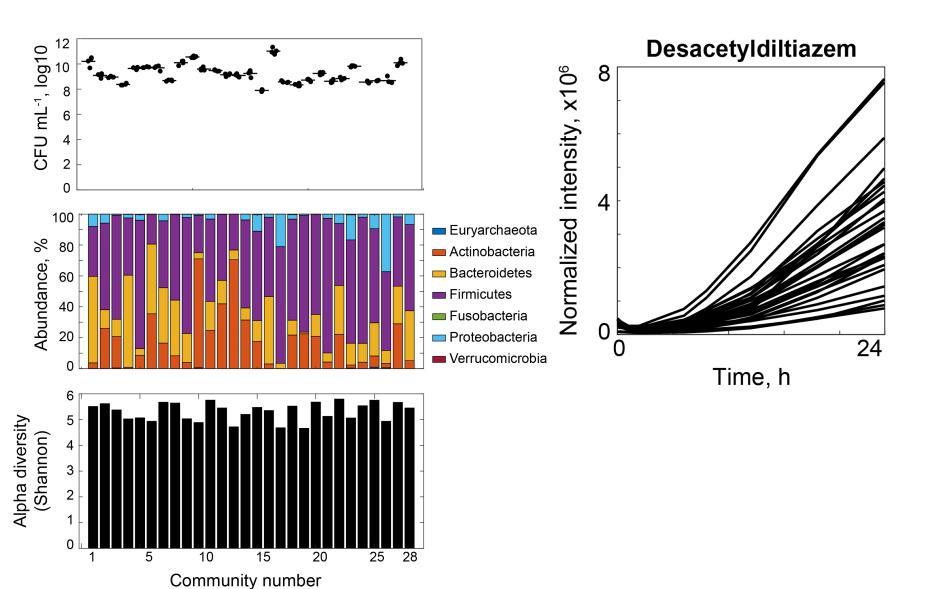


Diltiazem-metabolizing GoF inserts

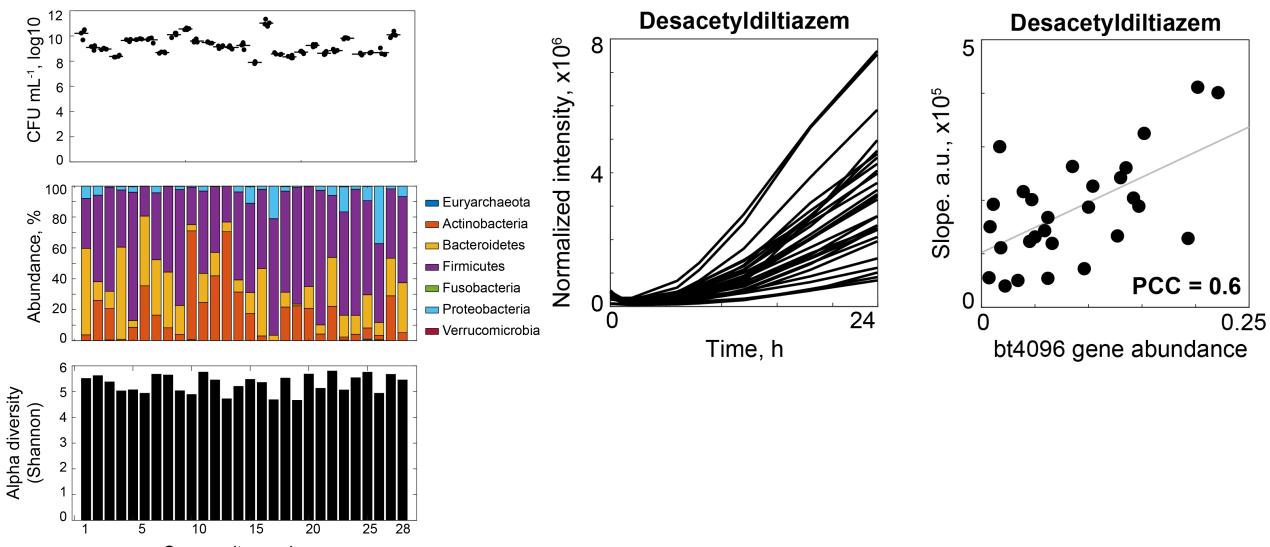


BT_4096 confirmed by targeted deletion and expression studies *in vitro* and in mice

Human gut communities exhibit variable diltiazem metabolism



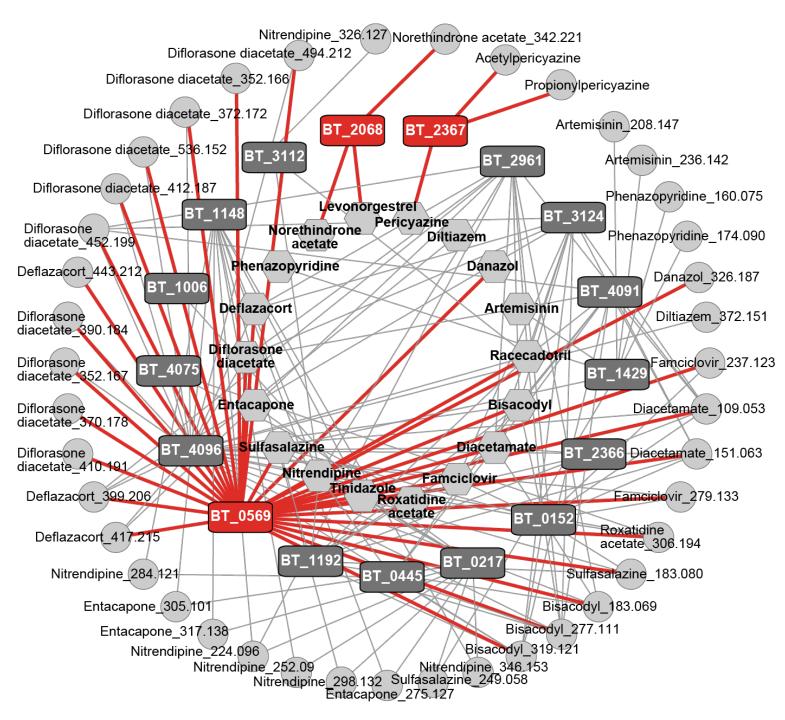
Identified genes help explain drug-metabolizing activity across human gut species and communities



Community number

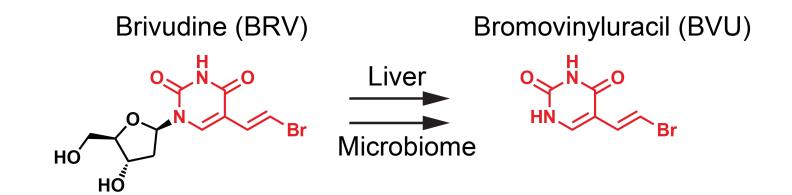
Gut microbes encode many drug-metabolizing enzymes

From 3 species, we found 30 microbiome-encoded enzymes that convert 20 drugs into 59 metabolites

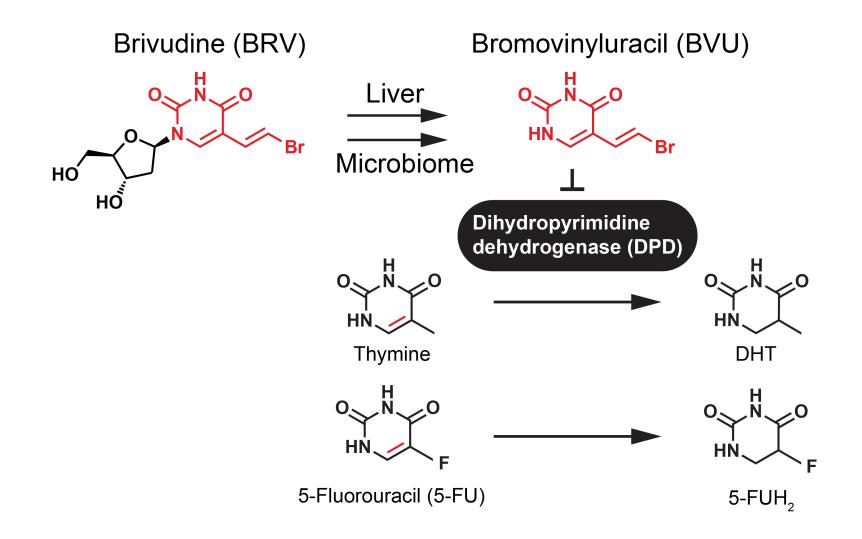


Could the microbiome contribute to the production of toxic drug metabolites if the liver has the same activity?

Could the microbiome contribute to the production of toxic drug metabolites if the liver has the same activity?

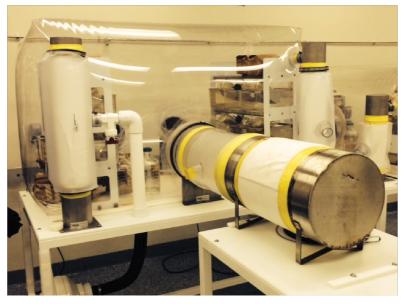


BVU is a toxic drug metabolite

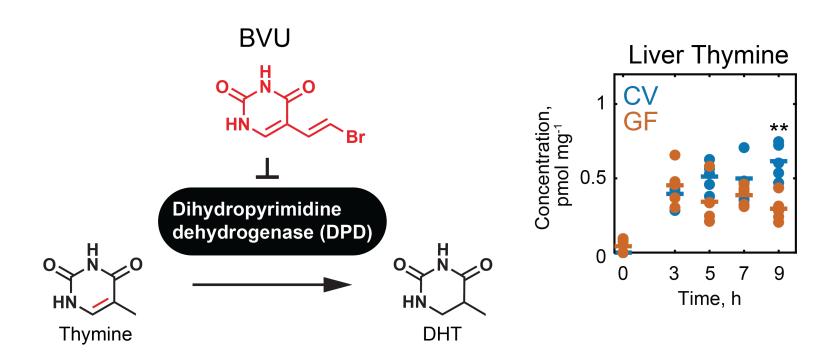


Germfree mice show reduced thymine accumulation in the liver after BRV administration

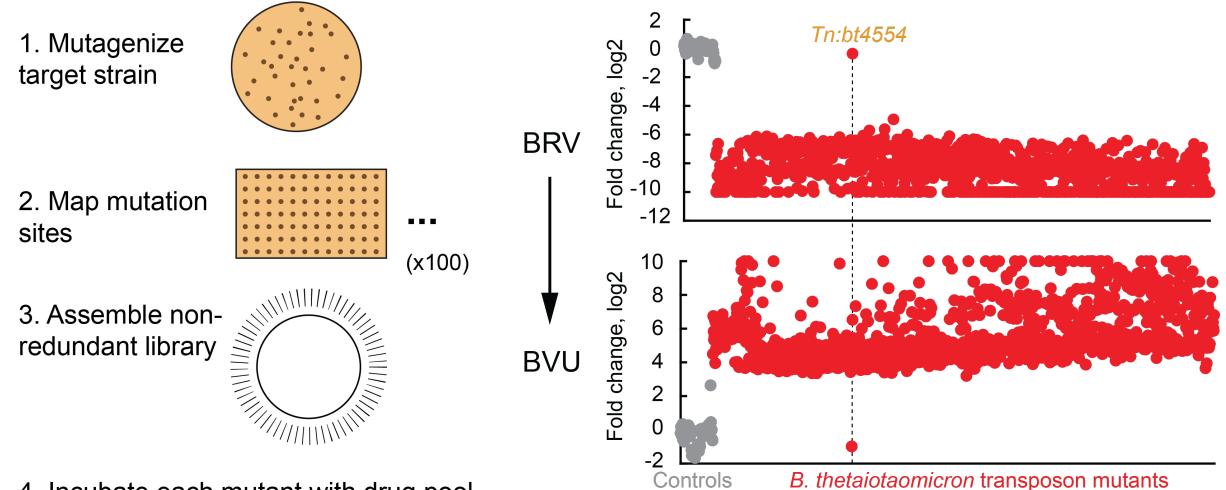
Gnotobiotic isolator



- Conventional (CV): complete flora
- Germfree (GF): no microbiome

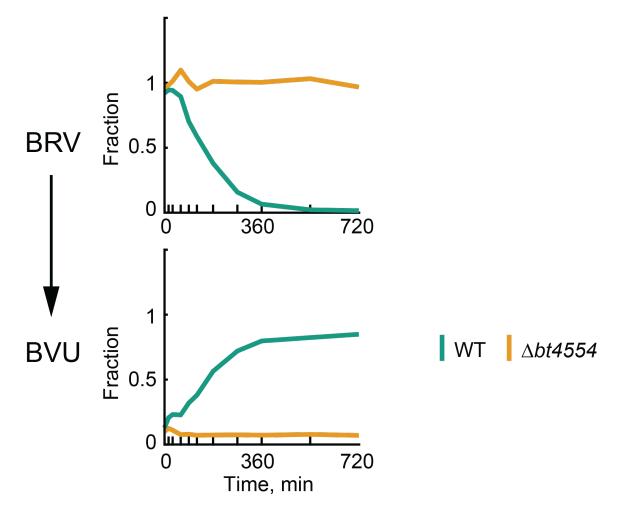


A loss-of-function strategy for identifying drug metabolizing enzymes

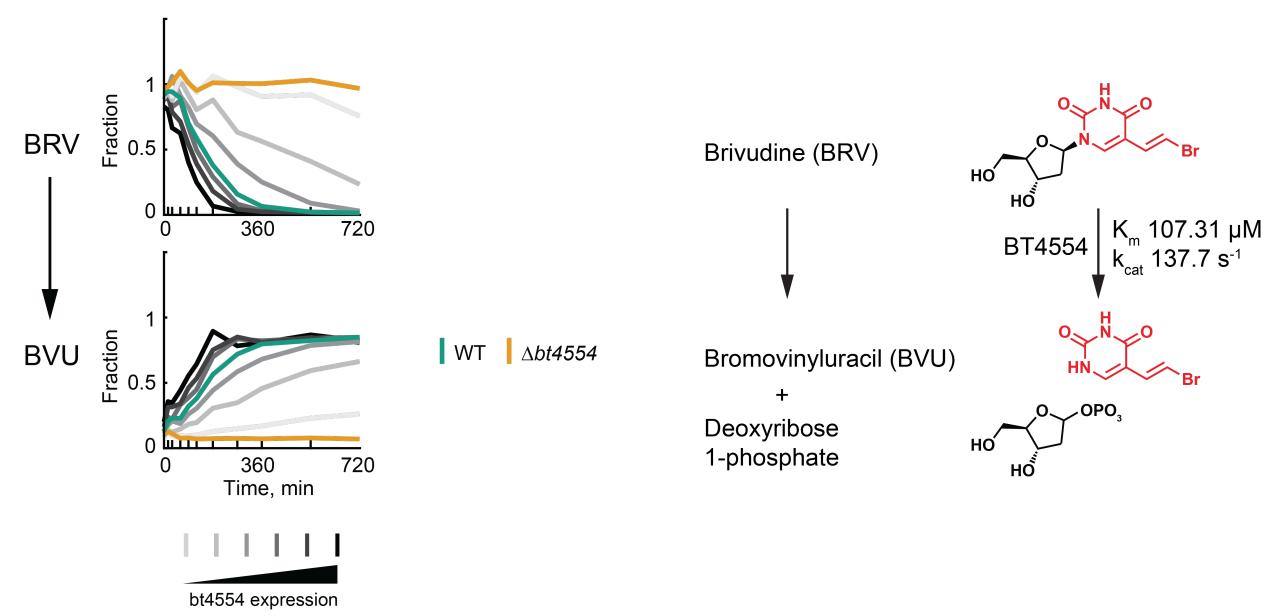


4. Incubate each mutant with drug pool

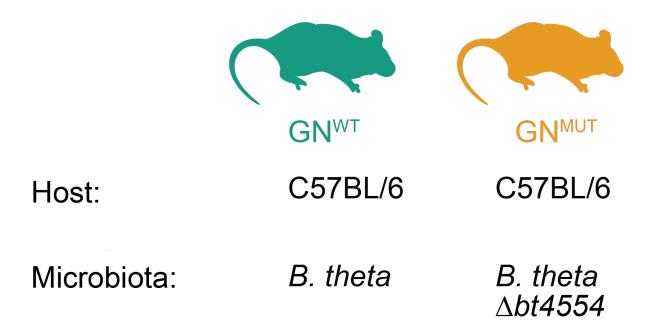
BT4554 is necessary, dose-limiting, and sufficient



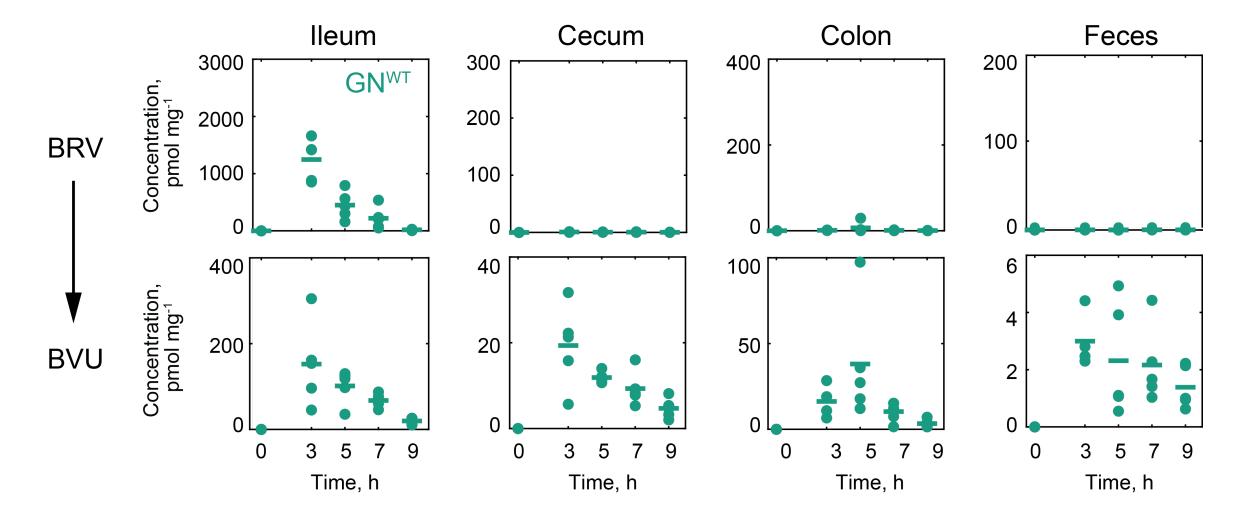
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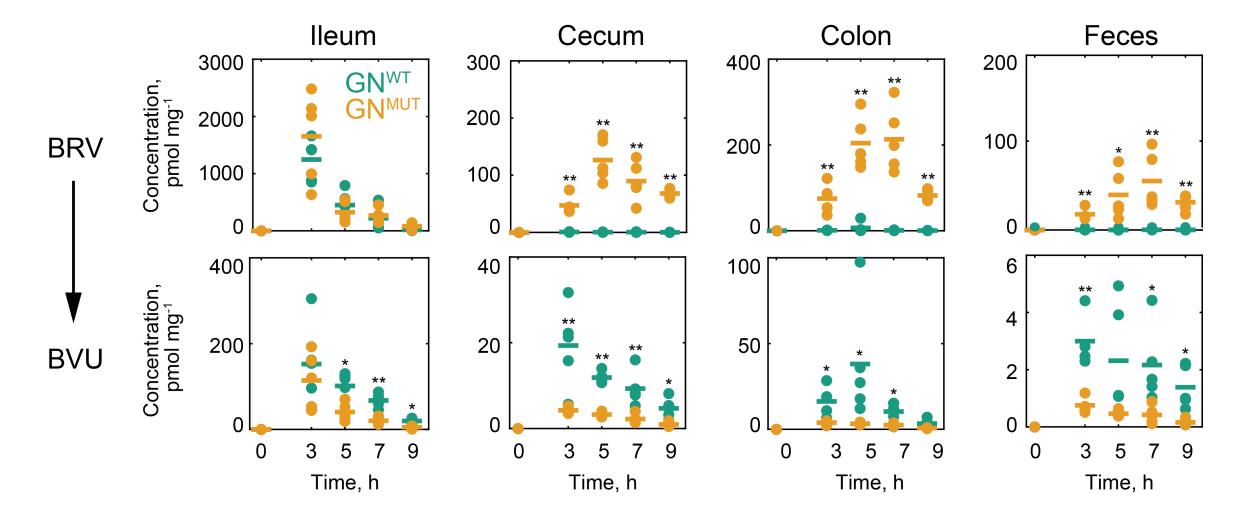
Pharmacokinetics in mice that vary in a single microbiomeencoded enzyme



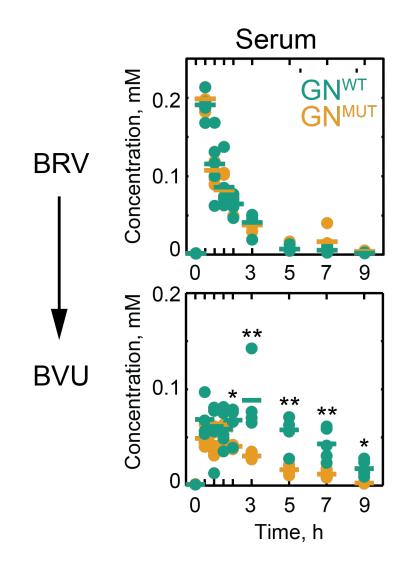
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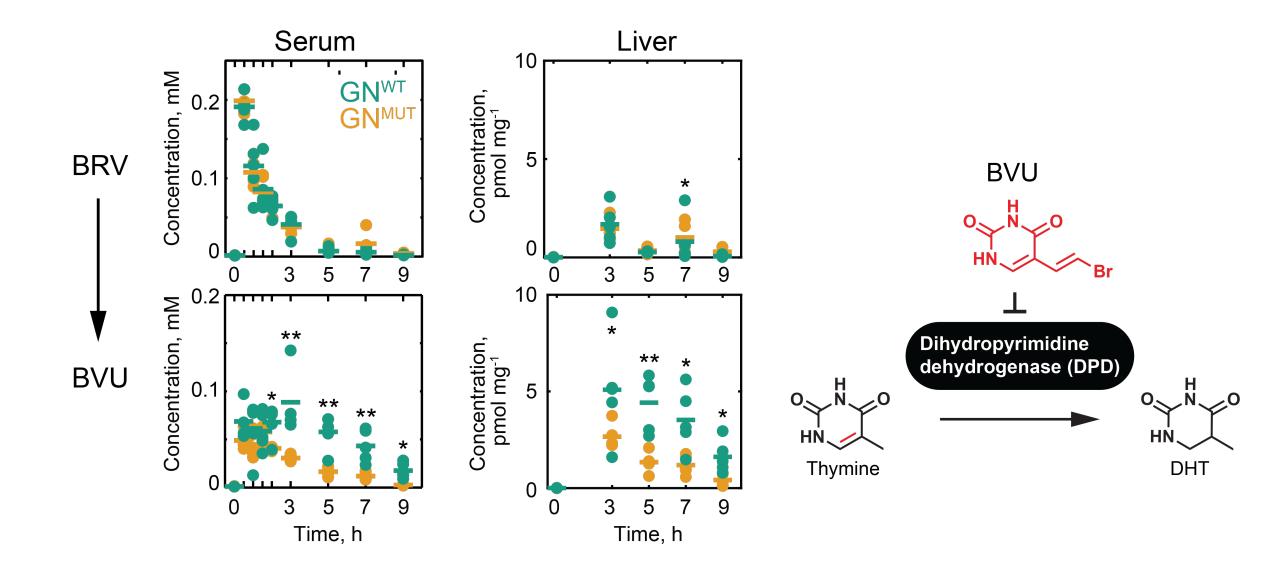
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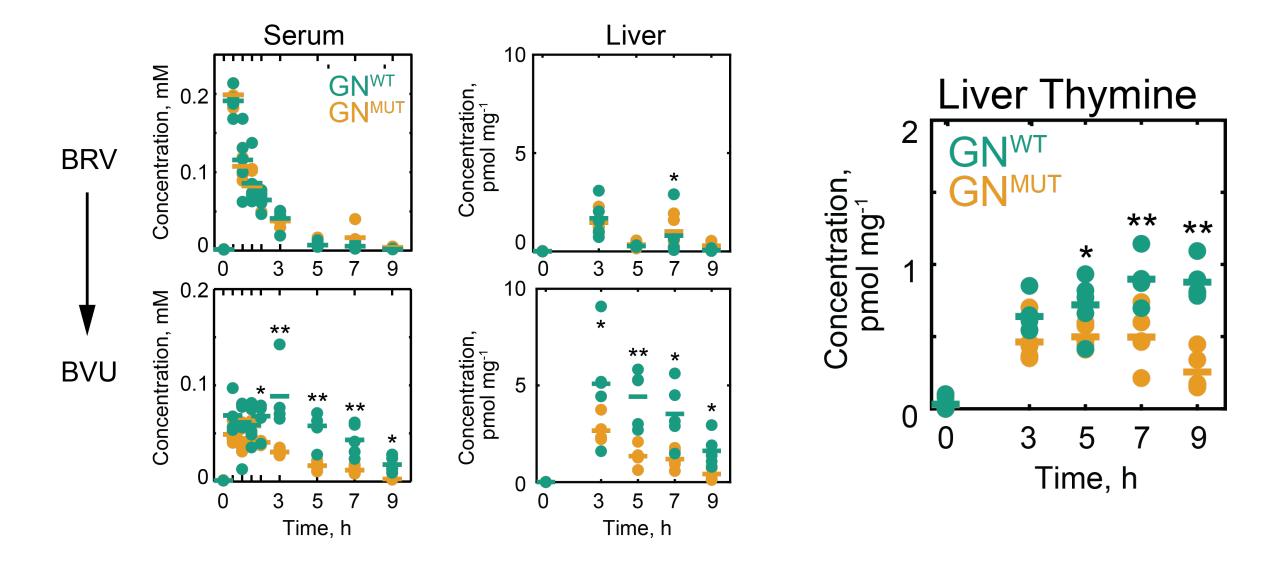
BVU is readily absorbed from the gut into systemic circulation

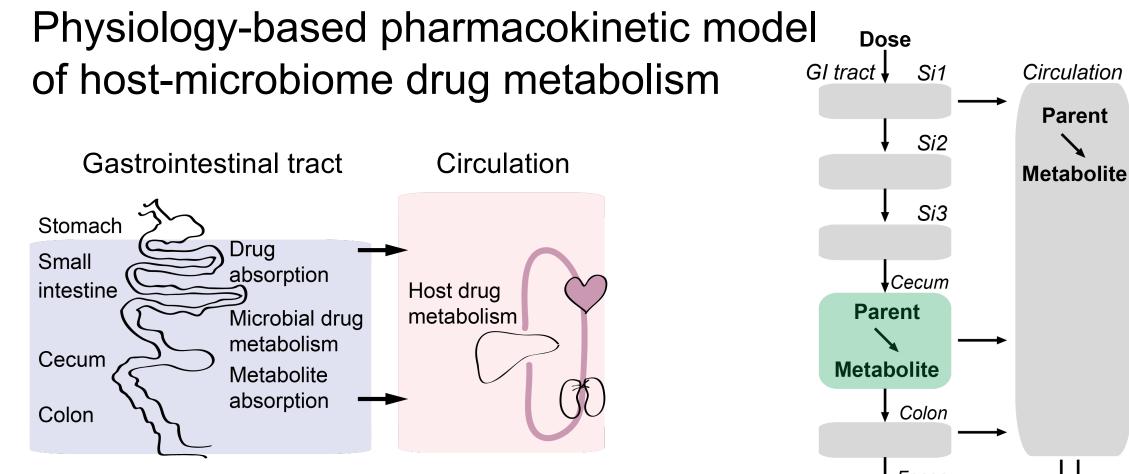


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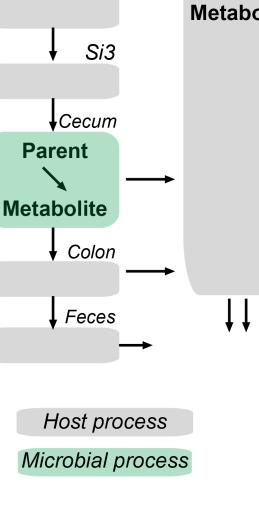


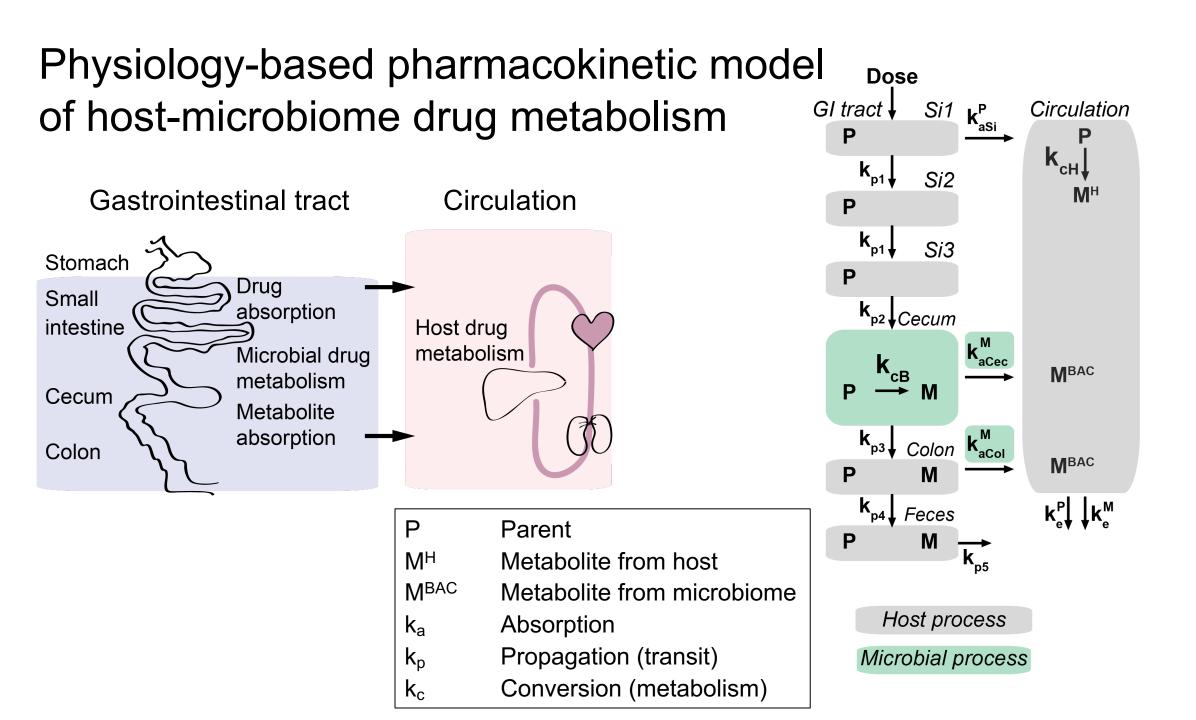
Drug metabolizing activity in the microbiome determines drug toxicity in the liver

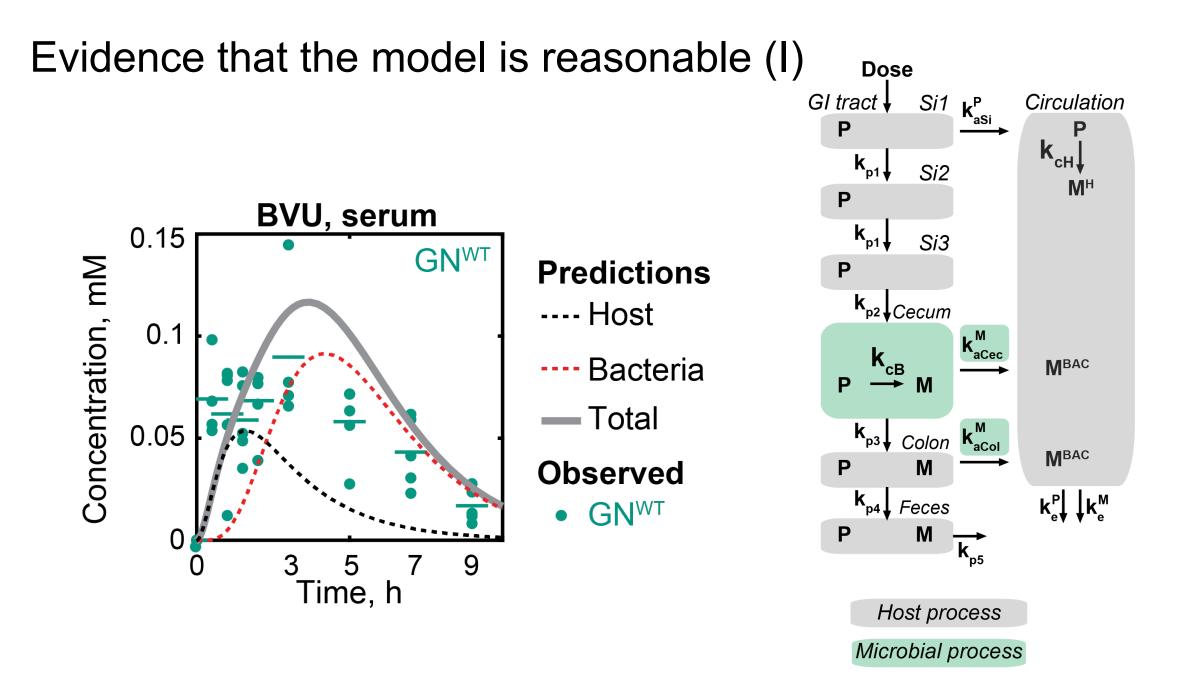




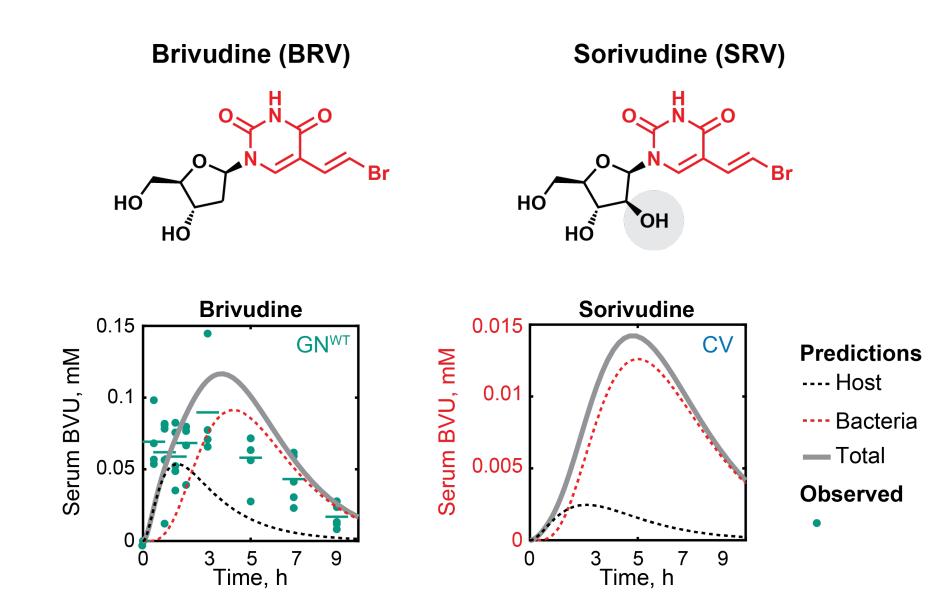
- Quantify microbiome contribution to serum drug metabolite exposure
- Estimate how different factors impact microbiome contribution



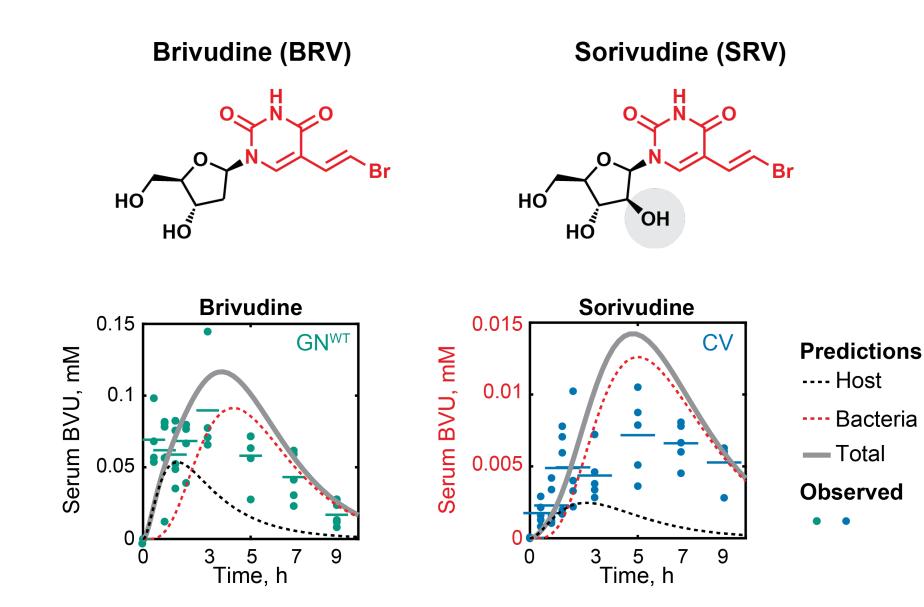




Evidence that the model is reasonable (II)



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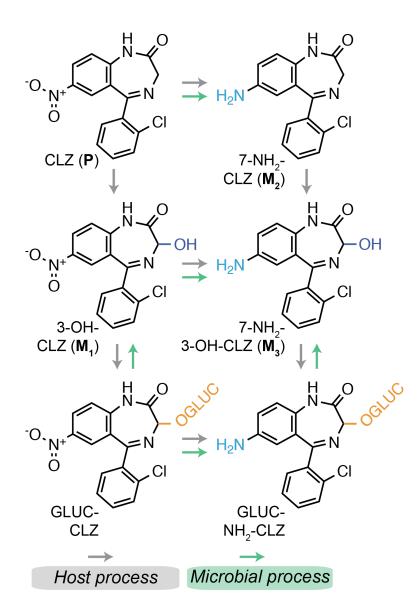


Evidence that the model is reasonable (III)

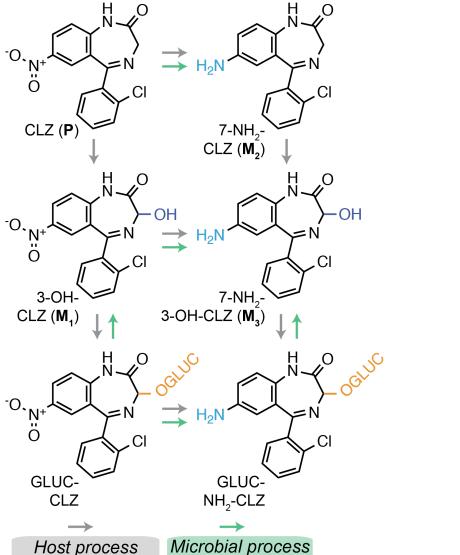


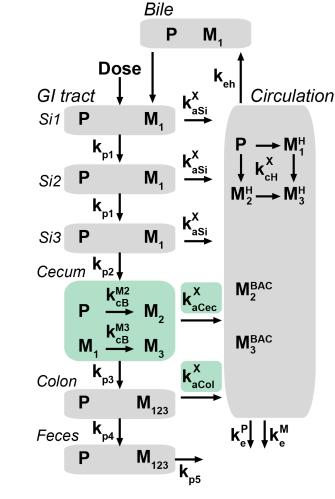
Clonazepam: anti-convulsant and anti-anxiety; nitro-reduced metabolites associated with toxicity

Clonazepam exhibits multiple metabolic routes and metabolites

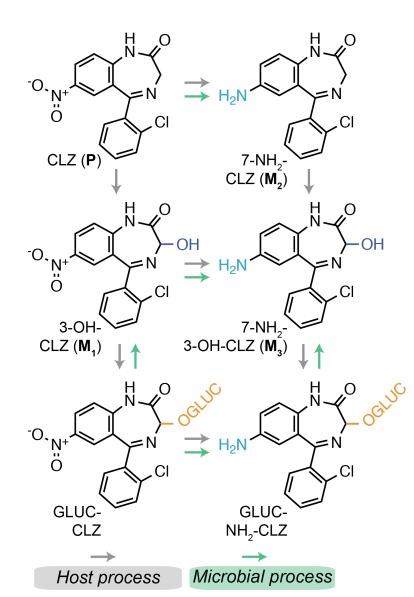


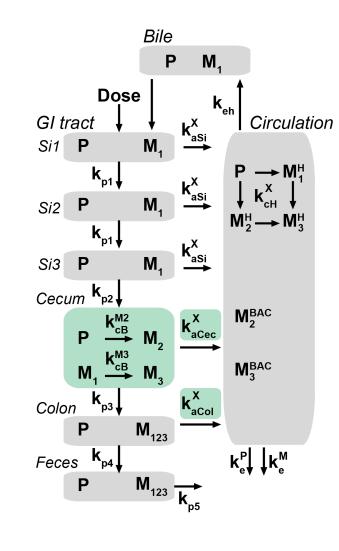
Clonazepam exhibits multiple metabolic routes and metabolites

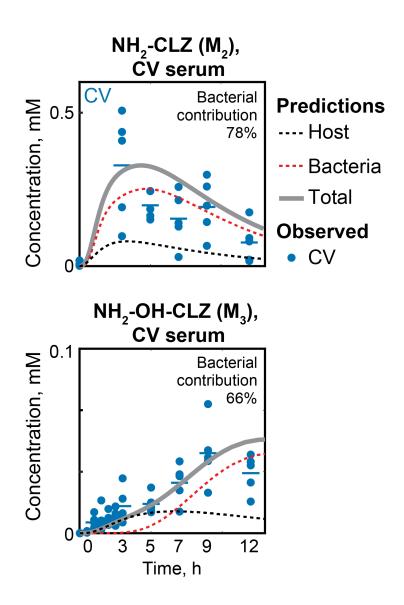


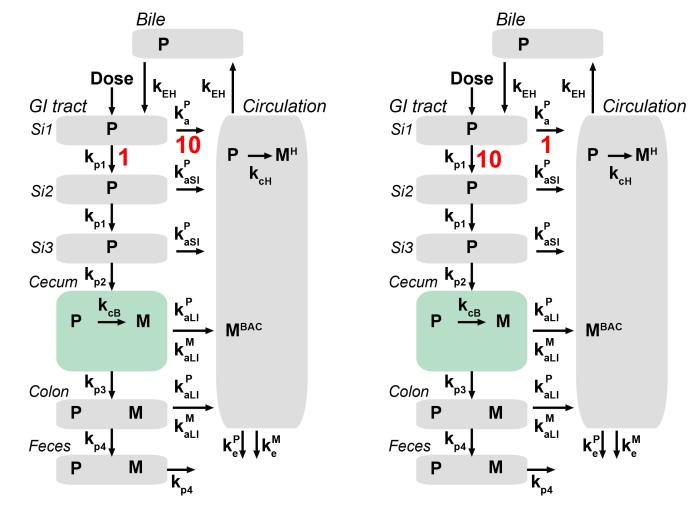


Evidence that the model is reasonable (III)









For each of 10,000 iterations:

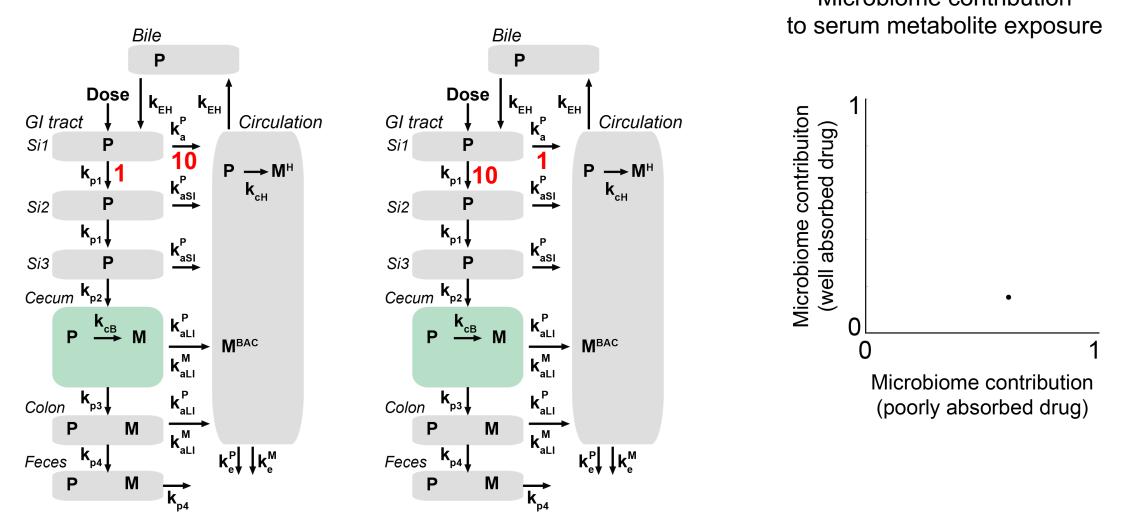
1. Randomize all parameters except absorption

2. Predict microbiome contribution to serum metabolite exposure if drug is well absorbed

3. Predict microbiome contribution to serum metabolite exposure if drug is poorly absorbed

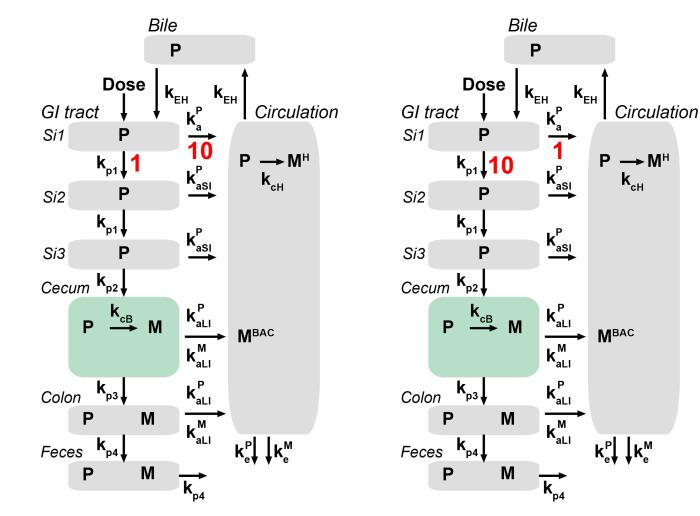
Well absorbed drug

Poorly absorbed drug



Well absorbed drug

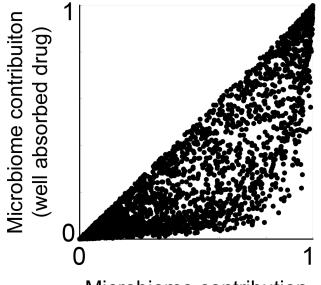
Poorly absorbed drug



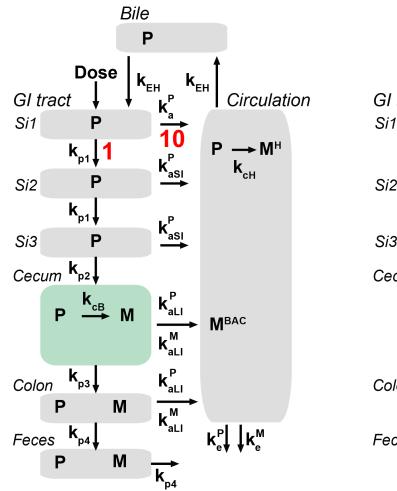
Well absorbed drug

Poorly absorbed drug

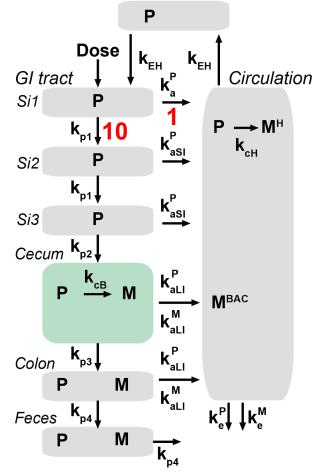
Microbiome contribution to serum metabolite exposure



Microbiome contribution (poorly absorbed drug)



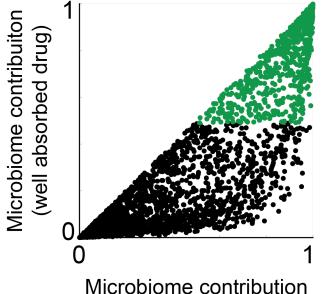
Well absorbed drug



Bile

Poorly absorbed drug

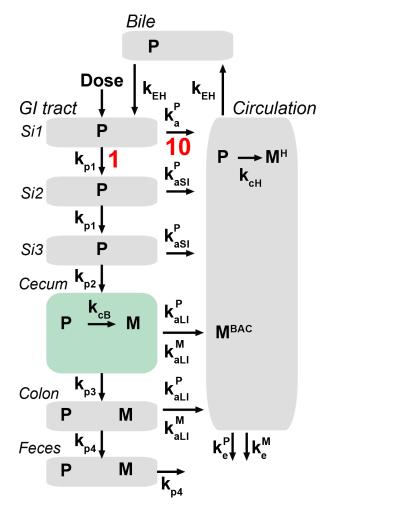
Microbiome contribution to serum metabolite exposure



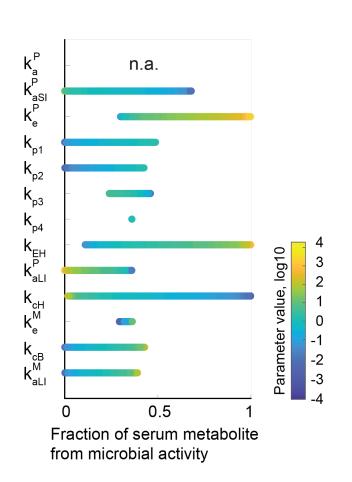
(poorly absorbed drug)

 Parameter set in which microbiome contributes >50% of serum metabolite exposure for well absorbed drug

Local sensitivity analysis to identify contributing factors



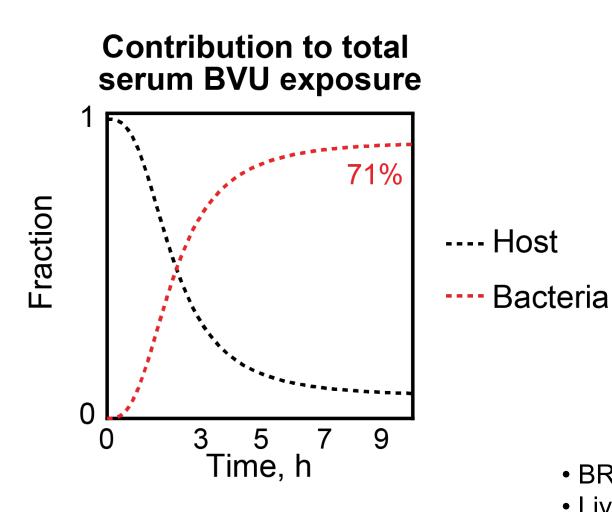
Well absorbed drug



Factors that favor a microbiome contribution to serum drug metabolite exposure (readily absorbed drug)

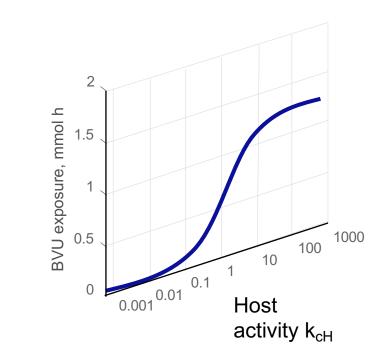
- Enterohepatic circulation (k_{EH})
- Rapid parent drug clearance (k^p_e)
- Reduced host metabolism (k_{cH})
- Reduced colonic transit (k_{p3})

Brivudine provides an example

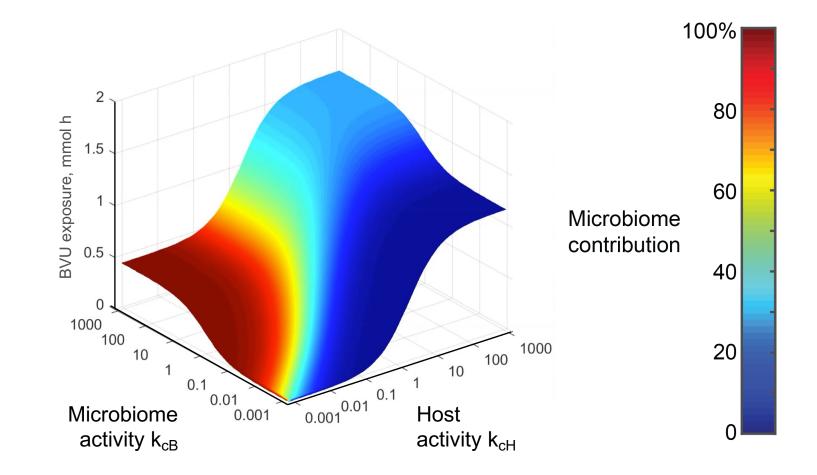


- BRV is fairly well absorbed (70% bioavailability)
- Liver extracts readily convert BRV to BVU
- Little BVU detected in feces

Pharmacogenomics

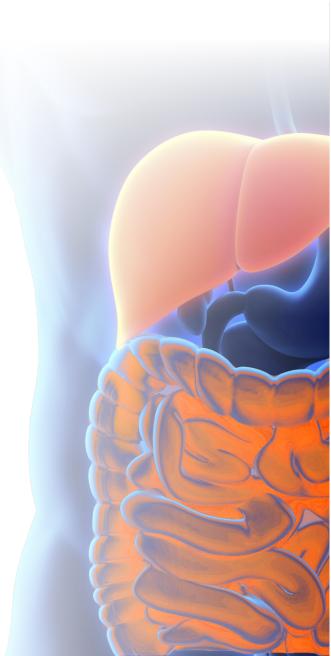


Pharmacogenomics of a host- and microbiome-metabolized drug





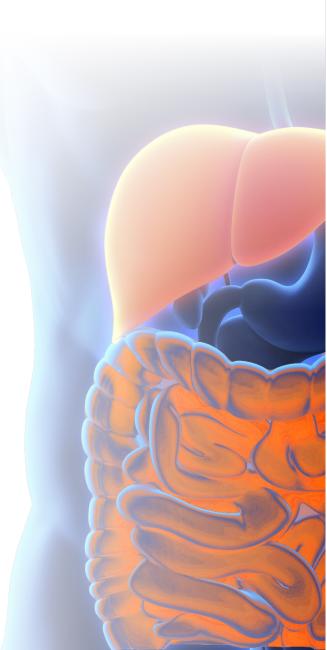
• Medical drugs serve as chemical tools to understand how gut microbes recognize and transform their environment





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 These approaches could impact how medical drugs are developed, tested in the appropriate patient cohorts during clinical trials, and administered

