## Modeling Path Importance for Effective Alzheimer's Disease Drug Repurposing (Supplementary Materials)\*

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## S1. The Top-50 Drugs Identified by MPI and BSL

Table S1: Top-50 Drugs from MPI

Drug	MOA	Indication	Anti-AD	Evidence
varenicline	AChR-Ag	smoking cessation	N	-
fosinopril	ACE-INH	hypertension	Y	$in\ vivo^1$
nicotine	AChR-Ag	smoking cessation	Y	$clinical^2$
nizatidine	histamine receptor antagonist	duodenal ulcer disease	N	-
piroxicam	COX-INH	osteoarthritis	Y	$other^{3,4}$
meloxicam	COX-INH	osteoarthritis	Y	$in\ vivo^{5-7}$
galantamine	AChE-INH	Alzheimer's disease	Y	approved
bromfenac	COX-INH	inflammation	N	-
etodolac	COX-INH	osteoarthritis	Y	$in\ vivo^8$
pyridostigmine	AChE-INH	myasthenia gravis	N	-
bupropion	dopamine reuptake inhibitor	depression	N	-
pentoxifylline	phosphodiesterase inhibitor	claudication	N	-
flurbiprofen	COX-INH	rheumatoid arthritis	Y	$clinical^9$
zonisamide	sodium channel blocker	seizures	N	-
apixaban	coagulation factor inhibitor	stroke	Y	$other^{3,4}$
rivastigmine	AChE-INH	Alzheimer's disease	Y	approved
ramipril	ACE-INH	hypertension	Y	$clinical^{10}$
linezolid	bacterial 50S ribosomal subunit inhibitor	pneumonia	N	-
trandolapril	ACE-INH	hypertension	Y	$in\ vivo^{11}$

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moexipril ACE-INH hypertension N - quinapril ACE-INH hypertension N - enalapril ACE-INH hypertension N -	
• •	
benazepril ACE-INH hypertension N -	
lisinopril ACE-INH hypertension Y in vivo <sup>12</sup>	
hydralazine vasodilator hypertension Y in vitro <sup>13</sup>	
rasagiline monoamine oxidase inhibitor Parkinson's Disease Y clinical <sup>14</sup>	
ganciclovir DNA polymerase inhibitor cytomegalovirus Y in vivo <sup>15</sup>	
naproxen COX-INH pain relief N -	
fluvoxamine $\begin{array}{c} \text{selective serotonin} \\ \text{reuptake inhibitor} \end{array}$ $\begin{array}{c} \text{obsessive compulsive} \\ \text{disorder} \end{array}$ $\begin{array}{c} \text{Y} \\ \text{in } vivo^{16} \end{array}$	
dapsone bacterial antifolate dermatitis herpetiformis Y other <sup>17</sup>	
oxaprozin COX-INH osteoarthritis Y other <sup>3,4</sup>	
ranitidine histamine receptor antagonist heartburn N -	
donepezil AChE-INH Alzheimer's disease Y approved	
memantine glutamate receptor antagonist Alzheimer's disease Y approved	
sodium/glucose cotransporter diabetes	$in\ vivo^{18}$
empagliflozin $\frac{\text{solutility glucose Cottansporter}}{\text{inhibitor}}$ $\frac{\text{diabetes}}{\text{mellitus}}$ $\frac{\text{Y}}{\text{in } vivo^{18}}$	
sodium/glucose cotransporter diabetes	
canagliflozin solutin/glucose cotransporter diabetes N - mellitus	
alogliptin dipeptidyl peptidase inhibitor diabetes mellitus Y $in\ vivo^{19}$	,20
oxiconazole bacterial cell wall synthesis inhibitor tinea pedis N -	
rivaroxaban coagulation factor inhibitor stroke Y $in\ vivo^{21}$	
fluoxetine $\begin{array}{c} \text{selective serotonin} \\ \text{reuptake inhibitor} \end{array}$ depression $\begin{array}{c} \text{Y} & in \ vivo^{22} \end{array}$	
azelastine histamine receptor antagonist conjunctivitis N -	
$\begin{array}{c} \text{selective serotonin} \\ \text{reuptake inhibitor} \end{array} \qquad \qquad \text{depression} \qquad \qquad \qquad \text{N}  \text{-}$	
ibuprofen COX-INH headache N -	
labetalol adrenergic receptor antagonist hypertension N -	
$\begin{array}{c} \text{duloxetine} & \begin{array}{c} \text{norepinephrine reuptake} \\ \text{inhibitor} \end{array} & \text{depression} \end{array} \qquad $	
$\begin{array}{c} \text{quinine} & \begin{array}{c} \text{hemozoin biocrystallization} \\ \text{inhibitor} \end{array}  \text{malaria} \qquad \qquad \text{N}  \text{-} \end{array}$	
trihexyphenidyl acetylcholine receptor antagonist parkinsonism N -	
ketoprofen COX-INH rheumatoid arthritis N -	
selegiline monoamine oxidase inhibitor Parkinson's Disease N -	
nortriptyline tricyclic antidepressant depression N -	

In this table, the column "Drug" shows the identified top-50 ranked drugs; the column "MOA" shows the mechanism of action of each drug; the column "Indication" presents the indication of each drug; the column "Anti-AD" indicates if the drug has evidenced anti-AD effects; and the column "Evidence" presents the type of the evidence. In this table, ACE-INH represents the angiotensin converting enzyme inhibitor; COX-INH represents the cyclooxygenase inhibitor; AChE-INH represents the acetylcholine receptor agonist.

Table S2: Top-50 Drugs from BSL

Drug	MOA	Indication	Anti-AD	Evidence
tetracycline	bacterial 30S	respiratory tract	Y	in vitro <sup>23</sup>
tetracycline	ribosomal subunit inhibitor	infections	1	tit vitio
selegiline	monoamine oxidase inhibitor	Parkinson's Disease	N	-
ceftriaxone	bacterial cell wall synthesis inhibitor	gonorrhea	Y	$in\ vivo^{24}$
ibuprofen	COX-INH	headache	N	-
levobunolol	adrenergic receptor antagonist	glaucoma	N	_
ketoprofen	COX-INH	rheumatoid arthritis	N	-
carbidopa	aromatic L-amino acid decarboxylase inhibitor	Parkinson's Disease	N	-
sulindac	COX-INH	osteoarthritis	Y	$in\ vivo^{25}$
biotin	vitamin B	supplement	Y	$in\ vivo^{26}$
lansoprazole	ATPase inhibitor	heartburn	N	_
itraconazole	cytochrome P450 inhibitor	onychomycosis	N	_
ketorolac	COX-INH	pain relief	N	_
quinidine	sodium channel blocker	malaria	N	_
terbinafine	fungal squalene epoxidase inhibitor	tinea pedis	N	_
labetalol	adrenergic receptor antagonist	hypertension	N	_
vilazodone	serotonin reuptake inhibitor	depression	N	_
ivermectin	benzodiazepine receptor agonist	gastrointestinal roundworms	N	-
oxiconazole	bacterial cell wall synthesis inhibitor	tinea pedis	N	-
dabigatran	thrombin inhibitor	stroke	Y	$in\ vivo^{27}$
linezolid	bacterial 50S ribosomal subunit inhibitor	pneumonia	N	-
indomethacin	COX-INH	rheumatoid arthritis	Y	$clinical^{28}$
donepezil	AChE-INH	Alzheimer's disease	Y	approved
levodopa	dopamine precursor	Parkinson's Disease	N	-
ketoconazole	sterol demethylase inhibitor	seborrheic dermatitis	N	-
loratadine	histamine receptor antagonist	allergic rhinitis	N	-
lovastatin	HMGCR inhibitor	coronary heart disease	Y	$other^{29}$
triamterene	sodium channel blocker	hypokalemia	Y	$clinical^{30}$
captopril	ACE-INH	hypertension	Y	$in\ vivo^{31}$
naproxen	COX-INH	pain relief	N	-
methyldopa	adrenergic receptor agonist	hypertension	N	_
fluvoxamine	selective serotonin reuptake inhibitor	obsessive compulsive disorder	Y	$in\ vivo^{16}$
zonisamide	sodium channel blocker	seizures	N	_
diflunisal	prostanoid receptor antagonist	rheumatoid arthritis	Y	$in\ vivo^{32}$
sertraline	selective serotonin reuptake inhibitor	depression	N	-
rasagiline	monoamine oxidase inhibitor	Parkinson's Disease	Y	$clinical^{14}$
_	calcium channel blocker	hypertension	Y	$in \ vivo^{33}$
verapamil				เน ขนขอ
metociopramide	dopamine receptor antagonist	gastroparesis	N	-

diclofenac	COX-INH	rheumatoid arthritis	Y	$other^{34}$
bupropion	dopamine reuptake inhibitor	depression	N	-
amiloride	sodium channel blocker	hypertension	Y	$clinical^{30}$
vortioxetine	serotonin receptor agonist	depression	N	-
trazodone	adrenergic receptor antagonist	depression	N	-
losartan	angiotensin receptor antagonist	hypertension	N	-
trihexyphenidyl	acetylcholine receptor antagonist	parkinsonism	N	-
fluoxetine	selective serotonin reuptake inhibitor	depression	Y	$in\ vivo^{22}$
azelastine	histamine receptor antagonist	conjunctivitis	N	_
nicotine	AChR-Ag	smoking cessation	Y	$clinical^2$
dexamethasone	glucocorticoid receptor agonist	hypercalcemia	Y	$in\ vivo^{35}$
doxazosin	adrenergic receptor antagonist	benign prostatic hyperplasia	Y	$in\ vitro^{36}$
tramadol	centrally-acting opioid agonist	pain management	N	-

These columns have the same meaning as those in Table S1.

## S2. BSL Survival Analysis

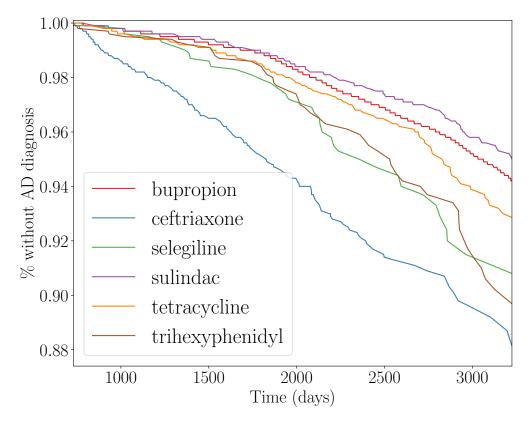


Fig. S1: Unadjusted Kaplan-Meier plots for BSL's top-ranked evidential drugs.

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