

SUPPORTING INFORMATION

Computational Neural Networks. Most computational neural networks (CNNs) perform a similar task: an input-to-output vector mapping. The primary difference is only in the way this task is performed. Typically, only one or a small number of paradigms are needed to treat most practical problems. Multilayer feedforward CNNs trained with the backpropagation algorithm are by far the most commonly applied. This is primarily because these networks can approximate any Borel-measurable function (i.e., they are universal function approximators), have a proven history, and are easy to implement. Below we discuss how to maximize the probability of success when using backpropagation or basis-function CNNs to solve practical problems.

Supervised neural networks require training and testing data sets. Unbiased selection of these sets from the available data is best achieved by using statistical resampling methods such as the bootstrap and jackknife (leave-k-out) methods. The bootstrap method is a powerful procedure for determining the best estimator for small data sets. Bootstrap resampling is basically random sampling with replacement: a data set of N examples is randomly sampled N times to create a new data set with N examples. The new data set will have the possibility of sample repetition and a test set can be generated by comparing the new data set with the original one and selecting unique examples. Thus the bootstrap method can be used to produce a number of different training and test sets and the error estimate is taken as the average performance on the data set ensembles. In general, about 200 iterations of bootstrap estimates are needed to obtain a good representation.

Bootstrap resampling is only one of several methods that provide desirable properties in error rate estimates. Another method that works very well for neural network training and testing is the jackknife method. The general procedure is to take one (it also can be generalized to k) sample out of the available data as a test set and train on the remaining ones. This is repeated for all of the samples, producing an ensemble that is the same size as the original data set. This procedure can be used in the same fashion as described for the bootstrap but requires fewer runs.

By using statistical resampling (bootstrap or jackknife coupled with initial state sampling), a CNN can be trained on an ensemble of different training sets and the performance (cross-validation) evaluated on the complement testing sets to determine a measure of the true performance (i.e., the average over the ensemble). This approach, called the ensemble-average

method, not only gives a better estimate of the true error (unbiased) but also reduces the size of the neural network (number of hidden nodes) over that required for any single training/testing computation and tends to smooth out (by averaging in function space instead of parameter space) the effects of over-fitting (variance reduction). An optimal CNN model for a given set of data can be obtained by performing ensemble averages over initial connection weights and training/test sets. This procedure is more computationally demanding than one consisting of a single run but provides an optimal and unbiased representation of the performance capabilities of a CNN.

Additional Figures and Tables

| | | | |
|---------|---------|---------|---|
| Benzene | | | |
| 6 | 6 | | |
| -0.6760 | 1.2099 | 0.0215 | C |
| 0.7097 | 1.1906 | -0.0095 | C |
| 1.3855 | -0.0192 | -0.0315 | C |
| 0.6758 | -1.2098 | -0.0226 | C |
| -0.7097 | -1.1901 | 0.0087 | C |
| -1.3855 | 0.0196 | 0.0308 | C |
| 1 | 2 | 2 | |
| 1 | 6 | 1 | |
| 2 | 3 | 1 | |
| 3 | 4 | 2 | |
| 4 | 5 | 1 | |
| 5 | 6 | 2 | |

Figure 1: A connection table for benzene. The first line shows that there are 6 atoms and 6 bonds in this molecule. The following 6 lines show the positions (in Cartesian coordinates) and type of each atom. The last 6 lines show how the atoms are bonded (i.e., atom 1 is bonded to atom 2 via a double (2) bond).

TABLE I: Chemicals Associated with Liver Injury**Chemicals with Acute Liver Injury as the Primary Toxic Effect**

| Category | Chemical Name | CAS # |
|----------------------|---------------------------|--------------|
| Aliphatic Nitros | 2-Nitropropane | 79-46-9 |
| Aromatic Amines | 4,4'-Methylenedianiline | 101-77-9 |
| Aromatic Nitros | 2,4,6-Trinitrotoluene | 118-96-7 |
| Chlorinated Solvents | Ethylene dichloride | 107-06-2 |
| Chlorinated Solvents | 1,1,2,2-Tetrachloroethane | 79-34-5 |
| Chlorinated Solvents | Carbon tetrachloride | 56-23-5 |
| Chlorinated Solvents | Propylene dichloride | 78-87-5 |
| Halogenated Solvents | Carbon tetrabromide | 558-13-4 |
| Halogenated Solvents | Acetylene tetrabromide | 79-27-6 |
| Halogenated Solvents | Ethylene dibromide | 106-93-4 |
| Halowaxes | Hexachloronaphthalene | 1335-87-1 |
| Halowaxes | Octachloronaphthalene | 2234-13-1 |
| Halowaxes | Pentachloronaphthalene | 1321-64-8 |
| Halowaxes | Tetrachloronaphthalene | 1335-88-2 |
| Halowaxes | Trichloronaphthalene | 1321-65-9 |
| Nitrosamines | N-Nitrosodimethylamine | 62-75-9 |
| Other Solvents | Dimethylformamide | 68-12-2 |
| Other Solvents | Tetrahydrofuran | 109-99-9 |
| Other Solvents | Dimethyl acetamide | 127-19-5 |
| Other Organics | Diphenyl | 92-52-4 |

Chemicals with Liver Injury as a Secondary Toxic Effect: Elevated Liver Enzyme Levels

| Category | Chemical Name | CAS # |
|----------------------|-----------------------------------|--------------|
| Alcohols | Ethyl alcohol | 64-17-5 |
| Alcohols | Ethylene chlorohydrin | 107-07-3 |
| Alcohols | Methylcyclohexanol | 25639-42-3 |
| Alcohols | <i>n</i> -Propyl alcohol | 71-23-8 |
| Alcohols | Propargyl alcohol | 107-19-7 |
| Aromatic Solvents | Cumene | 98-82-8 |
| Aromatic Solvents | Ethyl benzene | 100-41-4 |
| Aromatic Solvents | <i>p</i> -tert-Butyltoluene | 98-51-1 |
| Aromatic Solvents | Toluene | 108-88-3 |
| Aromatic Solvents | Xylene isomers | 1330-20-7 |
| Chlorinated Solvents | 1,1,1,2-Tetrachloroethane | 630-20-6 |
| Chlorinated Solvents | 1,1,1-Trichloroethane | 71-55-6 |
| Chlorinated Solvents | 1,1,2-Trichloroethane | 79-00-5 |
| Chlorinated Solvents | 1,1-Dichloroethane | 75-34-3 |
| Chlorinated Solvents | 1,2,3-Trichloropropane | 96-18-4 |
| Chlorinated Solvents | 1,2-Dichloroethylene, all isomers | 540-59-0 |
| Chlorinated Solvents | 1,3-Dichloropropene | 542-75-6 |
| Chlorinated Solvents | Chloroform | 67-66-3 |

Table I Continued

| Category | Chemical Name | CAS # |
|----------------------|--|--------------|
| Chlorinated Solvents | Ethyl chloride | 75-00-3 |
| Chlorinated Solvents | Methyl chloride | 74-87-3 |
| Chlorinated Solvents | Methylene chloride | 75-09-2 |
| Chlorinated Solvents | Tetrachloroethylene | 127-18-4 |
| Chlorinated Solvents | Trichloroethylene | 79-01-6 |
| Chlorofluorocarbons | 1,1,1,2-Tetrachloro-2,2-difluoroethane | 76-11-9 |
| Chlorofluorocarbons | 1,1,2,2-Tetrachloro-1,2-difluoroethane | 76-12-0 |
| Chlorofluorocarbons | CHLOROFLUOROCARBONS | |
| Chlorofluorocarbons | Chloropentafluoroethane | 76-15-3 |
| Chlorofluorocarbons | Dichloromonofluoromethane | 75-43-4 |
| Chlorofluorocarbons | Dichlorotetrafluoroethane | 76-14-2 |
| Chlorofluorocarbons | Difluorodibromomethane | 75-61-6 |
| Chlorofluorocarbons | Trifluorobromomethane | 75-63-8 |
| Cyclic Hydrocarbons | Cyclohexane | 110-82-7 |
| Cyclic Hydrocarbons | Cyclopentadiene | 542-92-7 |
| Cyclic Hydrocarbons | Methylcyclohexane | 108-87-2 |
| Esters | Vinyl acetate | 108-05-4 |
| Ethers | Dichloroethyl ether | 111-44-4 |
| Ethers | Dioxane | 123-91-1 |
| Ethers | Ethyl ether | 60-29-7 |
| Glycol Ethers | 2-Butoxyethanol | 111-76-2 |
| Glycol Ethers | 2-Ethoxyethanol | 110-80-5 |
| Glycol Ethers | 2-Methoxyethanol | 109-86-4 |
| Glycol Ethers | Diethylene glycol monobutyl ether | 112-34-5 |
| Glycol Ethers | GLYCOL ETHERS | |
| Halogenated Aromatic | 1,2,4-Trichlorobenzene | 120-82-1 |
| Halogenated Aromatic | Chlorobenzene | 108-90-7 |
| Halogenated Aromatic | <i>o</i> -Dichlorobenzene | 95-50-1 |
| Halogenated Solvents | Bromoform | 75-25-2 |
| Halogenated Solvents | Ethyl bromide | 74-96-4 |
| Other Solvents | Carbon disulfide | 75-15-0 |
| Other Solvents | Methylal | 109-87-5 |
| Refined Petroleum | Kerosene | 8008-20-6 |
| Refined Petroleum | Petroleum distillates | 8002-05-9 |
| Refined Petroleum | Stoddard solvent | 8052-41-3 |
| Refined Petroleum | VM & P Naphtha | 8032-32-4 |
| Amines, Aliphatic | Ethylamine | 75-04-7 |
| Amines, Aromatic | 4-Aminodiphenylamine | 101-54-2 |
| Amines, Aromatic | 4-Dimethylaminoazobenzene | 60-11-7 |
| Amines, Aromatic | Benzidine | 92-87-5 |
| Amines, Aromatic | Dapsone | 80-08-0 |
| Amines, Aromatic | Dichloroaniline (mixed isomers) | 27134-27-6 |
| Amines, Aromatic | Dichlorobenzidine base | 91-94-1 |
| Amines, Aromatic | Diphenylamine | 122-39-4 |
| Amines, Aromatic | Monomethyl aniline | 100-61-8 |
| Amines, Aromatic | <i>o</i> -Dianisidine-based dyes | 119-90-4 |
| Amines, Aromatic | <i>p</i> -Phenylene diamine | 106-50-3 |
| Amines, Aromatic | Xylidene, mixed isomers | 1300-73-8 |
| Amines, Heterocyclic | Morpholine | 110-91-8 |
| Ethanolamines | Ethanolamine | 141-43-5 |

Table I Continued

| Category | Chemical Name | CAS # |
|--------------------------|------------------------------|--------------|
| Hydrazines | 1,2-Diphenylhydrazine | 122-66-7 |
| Hydrazines | Hydrazine | 302-01-2 |
| Hydrazines | Phenylhydrazine | 100-63-0 |
| Nitriles | Acetonitrile | 75-05-8 |
| Nitriles | Isobutyronitrile | 78-82-0 |
| Nitriles | Malononitrile | 109-77-3 |
| Nitros, Aliphatic | 1,1-Dichloro-1-nitroethane | 594-72-9 |
| Nitros, Aliphatic | 1-Nitropropane | 108-03-2 |
| Nitros, Aliphatic | Nitroethane | 79-24-3 |
| Nitros, Aliphatic | Nitromethane | 75-52-5 |
| Nitros, Aromatic | Dinitolmide | 148-01-6 |
| Nitros, Aromatic | Dinitrotoluene, all isomers | 25321-14-6 |
| Nitros, Aromatic | <i>m</i> -Dinitrobenzene | 99-65-0 |
| Nitros, Aromatic | <i>m</i> -Nitroaniline | 99-09-2 |
| Nitros, Aromatic | Nitrobenzene | 98-95-3 |
| Nitros, Aromatic | <i>o</i> -Dinitrobenzene | 528-29-0 |
| Nitros, Aromatic | <i>p</i> -Dinitrobenzene | 100-25-4 |
| Nitros, Aromatic | Picric acid | 88-89-1 |
| Nitros, Aromatic | <i>p</i> -Nitroaniline | 100-01-6 |
| Nitros, Aromatic | <i>p</i> -Nitrochlorobenzene | 100-00-5 |
| Nitros, Aromatic | Tetryl | 479-45-8 |
| Nitrosamines | NITROSAMINES | |
| Nitrosamines | N-Nitrosodi-n-propylamine | 621-64-7 |
| Other Nitrogen Compounds | Cyclonite | 121-82-4 |
| Pyridines | Pyridine | 110-86-1 |

Table I shows chemicals that are associated with liver injury. The neural network model was able to classify each chemical as primary or secondary with 100 % accuracy.

Table II: Drugs and their Mechanism of Action³³

| Mechanism of Action* | Drug | Mechanism of Action* | Drug |
|-----------------------------|--------------------------|-----------------------------|-----------------------------------|
| A2 | Mitomycin | Db | Cyanomorpholinodoxorubicin |
| A2 | Porfiromycin | Db | Hycanthone |
| A6 | Carmustine (BCNU) | Db | Morpholino-adriamycin |
| A6 | Chlorozotocin | Db | N-N-Dibenzyl-daunomycin |
| A6 | Clomesone | Db | Pyrazoloacridine |
| A6 | Lomustine (CCNU) | Di | 5-6-Dihydro-5-azacytidine |
| A6 | Mitozolamide | Di | alpha-2'-Deoxythioguanosine |
| A6 | PCNU | Di | Azacytidine |
| A6 | Semustine (MeCCNU) | Di | beta-2'-Deoxythioguanosine |
| A7 | Asaley | Di | Thioguanine |
| A7 | Busulfan | Df | Aminopterin |
| A7 | Carboplatin | Df | Aminopterin-derivative |
| A7 | Chlorambucil | Df | Aminopterin-derivative |
| A7 | Cisplatin | Df | an-antifol |
| A7 | Cyclodisone | Df | an-antifol |
| A7 | Diaminocyclohexyl-Pt-II | Df | Baker's-soluble-antifolate |
| A7 | Dianhydrogalactitol | Df | Methotrexate |
| A7 | Diaziridinylbenzoquinone | Df | Methotrexate-derivative |
| A7 | Fluorodopan | Df | Trimetrexate |
| A7 | Hepsulfam | Dr | Guanazole |
| A7 | Iproplatin | Dr | Hydroxyurea |
| A7 | Mechlorethamine | Dr | Pyrazoloimidazole |
| A7 | Melphalan | Ds | Aphidicolin-glycinate |
| A7 | Piperazine mustard | Ds | Cyclocytidine |
| A7 | Piperazinedione | Ds | Cytarabine (araC) |
| A7 | Pipobroman | Ds | Floxuridine (FUdR) |
| A7 | Spiromustine | Ds | Fluorouracil (5FU) |
| A7 | Teroxirone | Ds | Ftorafur |
| A7 | Tetraplatin | Ds | Thiopurine (6MP) |
| A7 | Thiotepa | Rs | Acivicin |
| A7 | Triethylenemelamine | Rs | Dichloroallyl-lawsone |
| A7 | Uracil mustard | Rs | DUP785 (brequinar) |
| A7 | Yoshi-864 | Rs | L-Alanosine |
| T1 | Camptothecin | Rs | N-phosphonoacetyl-L-aspartic-acid |
| T1 | Camptothecin,7-Cl | Rs | Pyrazofurin |
| T1 | Camptothecin,9-MeO | Tu | Colchicine |

Table II continued

| Mechanism of Action* | Drug | Mechanism of Action* | Drug |
|-----------------------------|------------------------------|-----------------------------|--|
| T1 | Camptothecin,9-NH2 (RS) | Tu | Colchicine-derivative |
| T1 | Camptothecin,9-NH2 (S) | Tu | Dolastatin-10 |
| T1 | Camptothecin,10-OH | Tu | Halichondrin B |
| T1 | Camptothecin,11-formyl (RS) | Tu | Maytansine |
| T1 | Camptothecin,11-HOMe (RS) | Tu | Trityl-cysteine |
| T1 | Camptothecin,20-ester (S) | Tu | Vinblastine-sulfate |
| T1 | Camptothecin,20-ester (S) | Tu | Vincristine-sulfate |
| T1 | Camptothecin,20-ester (S) | Tu | Taxol (Paclitaxel) |
| T1 | Camptothecin,20-ester (S) | Tu | Taxol analog |
| T2 | Amonafide | Tu | Taxol analog |
| T2 | Amsacrine | Tu | Taxol analog |
| T2 | Anthrapyrazole-derivative | Tu | Taxol analog |
| T2 | Bisantrone | Tu | Taxol analog |
| T2 | Daunorubicin | Tu | Taxol analog |
| T2 | Deoxydoxorubicin | Tu | Taxol analog |
| T2 | Doxorubicin | Tu | Taxol analog |
| T2 | Etoposide | Tu | Taxol analog |
| T2 | Menogaril | Tu | Taxol analog |
| T2 | Mitoxantrone | Tu | Taxol analog |
| T2 | Oxanthrazole (piroxaantrone) | P90 | Geldanamycin |
| T2 | Teniposide | Uk | 3-Hydropicolinaldehyde-thiosemicarbazone |
| T2 | Zorubicin (Rubidazone) | Uk | 5-Hydroxypicolinaldehyde-thiosemicarbazone |
| Pi | L-Asparaginase | Uk | Inosine-glycodialdehyde |

*Alkylating agents: A2, A7=alkylating at N-2, N-7 position of guanine, respectively; A6, alkylating at O-6 position of guanine; T1, topoisomerase II inhibitor; T2, topoisomerase II inhibitor; Db, DNA binder; Di, DNA incorporation; Df, antifols; Dr, ribonucleotide reductase inhibitor; Ds, DNA synthesis inhibitor; Rs, RNA synthesis inhibitor; Tu, tubulin-active antimitotic agents; Pi, protein synthesis inhibitor; P90, hsp90 binder; Uk, unknown