Supplementary Material



Supplementary Figure 1. Benchmarking of 3DLigandSite on the cross-validation training-testing data. Receiver operator characteristic (ROC) curve and Precision-Recall curve shown for the prediction of binding site of non-metal (A and B) and metal (C and D) binding sites.

Supplementary Table 1. Features used in machine learning

Feature	Value range				
js divergence score (conservation)	0-1				
Amino acid properties					
Hydrophobicity	0-1				
Polar uncharged	0/1 (1 if polar uncharged, 0 otherwise)				
Isoelectric point	0-1				
Aromatic	0/1 (1 if aromatic, 0 otherwise)				
Van der Waals volume	0-1				
Positive	0/1 (1 if positive, 0 otherwise)				
Negative	0/1 (1 if negative, 0 otherwise)				
Amino acid	Each amino acid 1 if present, if not 0. I.e Is tyrosine? 1, Is alanine? 0				
3DLigandSite features					
Min ligand distance	0-1 (Value/10, any value greater than 1 is scored as 1)				
Max ligand distance	0-1 (Value/10, any value greater than 1 is scored as 1)				
Average ligand distance	0-1 (Value/10, any value greater than 1 is scored as 1)				
Ligand Contacts	0-1 (Percentage of ligands that the residue is within 0.8/0.4Å + VDW of/100)				

Supplementary Table 3. Testing, training, and validation dataset sizes. The training/test set was used for five-fold cross validation using an 80:20 split, with 80% of the data used for training and testing on the remaining 20%.

	Number of	Number of	Number of		
	binding sites	binding	non-binding		
		residues	residues		
Metal binding					
sites					
Train/test	1600	1976	1976		
Validation	2889	16166	825376		
Non-metal					
binding sites					
Train/test	1573	6950	6950		
Validation	3527	59203	1044947		

Supplementary Table 4. Benchmarking machine learning performance. The performance of four classifiers on datasets are summarised here. ET = Extra-Trees, RF = Random Forest, SVM = Support Vector Machine, LogR = LogisticRegression. Results for **A**) Non-metal ligands and **B**) Metal ligands.

A. Non-metal ligands

	Test			Validation Seq-Search			Validation Struc-Search		
Model	Precision	Recall	AUC *	Precision	Recall	AUC	Precision	Recall	AUC
ET	0.9	0.9	0.96	0.85	0.92	0.97	0.83	0.89	0.92
RF	0.9	0.9	0.96	0.86	0.92	0.98	0.84	0.89	0.93
SVM	0.91	0.91	0.93	0.9	0.93	0.94	0.87	0.89	0.9
LogR	0.91	0.91	0.95	0.91	0.92	0.99	0.88	0.89	0.95

*Average from 5-Fold CV

B. Metal ligands

	Test			Validation			Validation Struc-Search		
Model	Precision	Recall	AUC *	Precision	Recall	AU C	Precision	Recall	AUC
ET	0.89	0.89	0.96	0.71	0.89	0.96	0.71	0.78	0.84
RF	0.9	0.9	0.96	0.71	0.89	0.96	0.72	0.78	0.85
SVM	0.88	0.88	0.92	0.79	0.89	0.91	0.73	0.78	0.7
LogR	0.88	0.88	0.95	0.79	0.89	0.98	0.73	0.78	0.9

*Average from 5-Fold CV

Supplementary Table 5. CASP Assessment. The performance of the sequencebased and structure-based 3dligandsite tool on the CASP dataset.

Sequence- based	MCC	Precision	Recall	Targets
HHSearch Prob 75%	0.73	0.65	0.85	70
Structure Based				
TMScore 0.5	0.65	0.62	0.71	70
TMScore 0.6	0.72	0.67	0.8	70
TMScore 0.7	0.71	0.68	0.77	70
TMScore 0.8	0.69	0.65	0.77	70