

Supplementary Data for Accurate Prediction of Chemical Shifts for Aqueous Protein Structure on “Real World” Data

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Exclusion of erroneous chemical shifts assignments in the test dataset

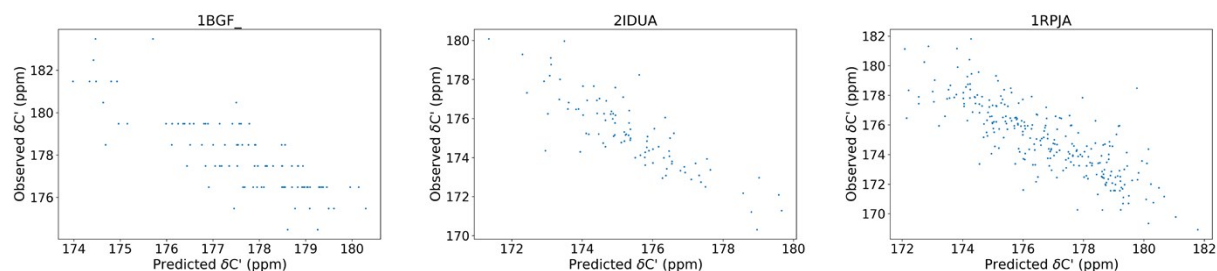
Table S1. Removed chemical shifts that are significantly offset from random coil average

PDBID	RESID	RESNAME	Recorded CS (ppm) [atom]
1MI4A	153	LEU	0.09 [H]
1DSBA	30	CYS	331.45 [CB]
2GYKE	62	ASP	89.55 [CB]
1GOA	119	TRP	26.57 [N]
1OVHA	1	MET	38.5 [N]
1D03A	1	ALA	40.47 [N]
2IGD	1	MET	39.34 [N]
1VB0A	1	LEU	39.84 [N]
1QOGA	1	ALA	39.52 [N]
1DSBA	51	PRO	152.99 [N]

Table S2. Excluded cysteine C β chemical shifts

PDBID	RESID	Oxidation state in crystal structure	Recorded C β CS (ppm)
2GOOB	40	reduced	48.59
2PF5A	47	reduced	43.71
1DSBA	33	oxidized	33.6
1VKBA	35	oxidized	31.16
1VKBA	62	oxidized	26.76
2AFGB	117	reduced	39.46
1LJUA	82	oxidized	30.66
1LJUA	89	oxidized	27.12

Figure S1. Scatter plot for the C' of the three proteins whose C' shifts are removed. Plotted are the observed C' chemical shifts versus predicted C' chemical shifts with UCBShift



Compilation of test dataset

Table S3. *A complete list of the 200 testing proteins.* Provided are the PDB identifier, BMRB identifier, the X-ray resolution (RES.), highest sequence similarity to any example in the training dataset (SIM.), total number of residues and the number of residues and atom types with experimental chemical shifts.

Rows with green background are data with low sequence homology (<30%).

PDB	BMRB	RES. (Å)	SIM.	Number of residues						
				Total	H	Ha	C'	Ca	Cβ	N
1MI4A	4854	1.7	0.998	427	209	198	236	229	199	217
2GP0A	15680	2.05	0.997	288	240	0	149	188	156	151
2H9HA	4836	1.39	0.995	212	201	170	202	212	186	201
1T85A	17415	1.8	0.995	406	305	0	0	299	196	233
2UYZA	4132	1.4	0.994	156	137	142	0	141	107	116
1GOA	4012	1.9	0.994	155	134	110	0	119	0	118
1SNO	1878	1.7	0.993	136	0	0	0	0	0	109
5NUC	5536	2.1	0.993	134	97	93	100	101	93	96
2EYOA	16585	1.7	0.993	135	118	117	125	126	117	118
1NBPA	6621	2.2	0.992	121	114	116	0	116	111	114
1LJUA	4944	1.4	0.992	130	118	105	109	125	116	118
1IP2A	5125	1.8	0.992	130	122	0	0	0	0	118
1AR0A	5888	2.3	0.992	125	114	0	0	112	100	108
7TIMB	16566	1.9	0.992	247	0	0	16	63	69	2
1OMSC	15813	2.3	0.992	114	107	104	112	114	105	107
1BRJA	975	2	0.991	107	101	94	0	0	0	0
2H76A	62	2.25	0.991	108	88	79	0	0	0	0
2HSHA	256, 257	1.35	0.990	105	59	60	0	0	0	0
1RN1B	1658	1.84	0.990	103	0	0	0	0	0	96
2OCTA	15548	1.4	0.990	97	84	0	89	88	83	84
1QOGA	447	1.8	0.990	98	76	79	45	84	80	79
2GYKE	4115, 4116	1.6	0.988	83	77	75	0	80	74	77
1POH	29	2	0.988	85	82	79	0	0	0	0
1SPQB	15066	2.16	0.988	239	185	0	0	183	146	147
1TPH2	15064	1.8	0.988	245	224	0	223	231	174	204
1J3FA	4568	1.45	0.987	152	144	121	143	146	124	144
109M	5158	1.83	0.987	154	129	0	131	142	0	129
1F2MA	1875, 495	2	0.987	136	0	108	0	76	1	0
2IN8A	16634	1.7	0.986	139	129	0	0	0	0	122
2FI4I	4877	1.58	0.983	58	46	46	0	0	0	0
1P2OD	45	2	0.983	58	47	44	0	0	0	0
2OW9B	4679	1.74	0.982	166	137	140	145	154	139	137
1BNEA	16169,	2.1	0.982	107	84	55	0	0	0	0

	16170									
1TXXA	1812, 1813	2.2	0.981	108	0	0	0	0	0	95
2SGDI	1375	1.8	0.980	51	0	0	0	43	15	0
1MOLB	4633	1.7	0.979	94	77	73	0	0	0	0
1IV9A	4222	1.9	0.979	96	84	80	0	0	0	78
1YJFA	5514	1.35	0.979	225	174	96	174	198	136	174
2HWNB	4473	1.6	0.978	45	39	41	0	43	41	39
2HZIB	15488	1.7	0.975	264	244	0	36	41	0	37
1QKRA	15653	1.8	0.973	172	146	0	139	146	126	130
2BC5C	1672	2.25	0.972	106	91	92	0	0	0	91
1XRKB	4785, 4786	1.5	0.968	121	104	104	103	110	104	104
1MYWA	15826	2.2	0.962	228	192	123	184	189	139	175
1DS3I	1374	1.65	0.961	50	39	38	0	0	0	0
1LW6I	4974	1.5	0.953	63	57	55	56	57	54	57
1U06A	7305, 7306	1.49	0.952	55	52	51	0	0	0	0
1SKOB	6181	2	0.946	116	108	104	0	114	106	108
1P7JA	7386	2.1	0.932	53	36	36	30	31	29	30
1AJ6	5218	2.3	0.932	194	177	143	169	161	106	160
2H61H	4105, 5895	1.9	0.924	90	80	79	78	83	78	80
1TCF	1553	1.9	0.899	156	57	53	0	0	0	0
1KTZB	5953, 5954, 4779	2.15	0.893	106	90	100	100	101	100	90
2B59A	5267	2.11	0.872	166	157	142	132	153	121	138
1B68A	6524	2	0.859	138	134	0	0	133	120	132
1BD9B	17382	2.05	0.834	185	170	169	181	184	169	170
1N3ZA	4980	1.65	0.815	117	108	108	0	0	0	101
1AG6	79	1.6	0.788	99	86	83	0	0	0	0
1IKOP	7220	1.92	0.764	141	127	120	127	133	122	127
2BIUX	6141, 7310	1.71	0.745	164	139	123	0	146	127	139
1OFFA	16024	1.8	0.735	95	91	88	0	0	0	91
1MR3F	15626	1.6	0.718	177	145	0	0	135	100	123
1Z7XX	4370	1.95	0.674	126	119	121	0	0	0	111
1GWYA	16362, 16630	1.71	0.674	175	169	154	166	175	154	169
7RXN	15374	1.5	0.673	52	44	43	0	0	0	44
1YCQA	6248	2.3	0.645	88	75	72	0	78	66	72
1JHFB	6373	1.8	0.644	111	96	0	89	101	83	90
1RDG	5163	1.4	0.635	52	45	42	0	0	0	0
1PCS	5475	2.15	0.580	98	84	80	0	0	0	0

2AFGB	15783, 16493, 16494, 16502, 6875	2	0.543	129	123	117	123	129	104	122
1WZVA	16321	2.1	0.535	150	129	50	125	141	136	129
2GCNA	16668	1.85	0.517	177	127	91	138	138	127	127
1L0SB	5573	2.3	0.500	87	76	67	81	79	72	76
1OKHB	4587	1.75	0.478	46	41	42	0	0	0	0
1OBOA	5011	1.2	0.477	169	145	130	0	0	0	136
1RCF_	16593	1.4	0.472	169	98	91	0	2	0	43
1FDQA	5320, 16042, 16046, 16047, 16048, 16049	2.1	0.466	131	128	121	0	130	121	128
1FU0A	4774	1.9	0.448	86	84	77	0	0	0	0
1EK8A	5190	2.3	0.438	185	175	0	181	181	0	167
2GGMB	5503, 6687	2.35	0.436	137	130	121	0	0	0	62
1HFZC	4811, 4332	2.3	0.435	121	111	99	0	0	0	110
1D03A	1673	1.85	0.424	169	160	142	0	0	0	159
2HPWA	16600	1.55	0.417	228	206	111	159	203	168	185
1YW5A	16690	1.6	0.412	177	165	0	170	170	158	165
1GPR_	1663	1.9	0.407	158	146	133	0	0	0	134
2HPR_	932	2	0.402	86	79	74	0	0	0	0
5HPGA	16466	1.66	0.393	84	75	73	0	0	0	75
1WYWB	6304	2.1	0.381	79	77	0	0	0	0	71
1DSBA	16327	2	0.381	188	0	0	146	167	124	151
1KDJ_	7370	1.7	0.373	102	96	0	0	0	0	90
1VB0A	16060	0.92	0.348	61	0	0	53	55	50	51
1ZDNA	17437	1.93	0.348	151	132	0	0	122	104	121
2AAOB	5324	2	0.343	131	118	115	0	114	104	111
1M8AB	15596	1.7	0.343	61	59	58	0	0	0	0
1IOZA	10051	2	0.339	162	156	0	0	0	0	153
2BJDA	6398	1.27	0.337	90	87	81	0	0	0	0
1V6PB	1381	0.87	0.333	62	55	51	0	0	0	0
1RB4B	371	1.9	0.333	32	31	30	0	0	0	0
2PF5A	6392, 6393	1.9	0.327	88	84	78	84	88	78	84
2SEMA	5729	2.2	0.317	58	49	48	50	52	48	48
2IDSA	16740	1	0.295	105	93	0	0	0	0	93
1EQTB	16803	1.6	0.294	67	58	60	57	62	60	58
3DFR_	7200,	1.7	0.286	162	147	0	0	0	0	137

	7196, 7197, 7198, 7199									
1H0JB	4966	1.9	0.283	60	54	58	0	59	0	0
1BAZC	394, 395	1.9	0.283	46	41	40	0	0	0	0
1DCDB	5249	2	0.278	36	35	26	0	32	0	35
1OKSA	6568, 6569	1.8	0.268	50	48	0	0	0	0	47
1R1TA	4128, 4306	1.7	0.262	98	96	0	0	97	0	93
2GITE	5784, 5169, 3078	1.7	0.260	100	92	97	0	0	0	0
1W7ZC	397	1.67	0.258	31	26	23	0	0	0	0
2IDUA	16741	0.95	0.257	104	95	0	94	99	89	95
1UWXA	1639	2.2	0.254	57	54	50	0	0	0	0
1HC9A	8, 4195, 5006, 5024	1.8	0.243	74	63	68	0	0	0	0
1CM9B	4914, 4852	2.1	0.243	66	60	63	0	0	0	58
1HC9B	15130	1.8	0.243	74	0	70	0	74	0	0
1YU7X	4428	1.5	0.239	64	57	58	0	0	0	56
1ZNIC	1632, 1585, 554, 1344	1.5	0.238	21	20	20	0	0	0	0
2F91B	5274	1.2	0.229	32	29	29	0	0	0	0
2ALGA	16294	2.3	0.228	92	77	69	0	0	0	0
1PZ4A	16662	1.35	0.224	113	106	104	0	109	100	102
2IE2C	17162, 17163	1.7	0.223	212	194	0	0	191	161	174
1CLVI	4490, 4404	2	0.219	32	27	29	0	0	0	0
2GJ2A	7099	2.35	0.212	79	77	74	0	78	68	74
1PHT	16448	2	0.212	83	0	0	46	69	46	61
2CA5B	15214	2.1	0.212	61	50	0	0	16	10	39
1WKXA	6123	1.7	0.209	43	31	30	0	0	0	0
1LP1B	1120, 4324	2.3	0.207	54	12	13	0	0	0	12
2FFGA	15529	2.31	0.207	77	68	0	0	61	57	61
1LU0B	4246	1.03	0.207	29	27	26	0	0	0	0
1PPEI	199, 314, 2227, 2527	2	0.207	29	3	5	0	0	0	0

1HSLB	16204, 16205	1.89	0.206	238	215	169	221	216	184	204
1PGX	2575	1.66	0.205	70	58	54	0	0	0	0
1OVHA	915	1.95	0.201	162	152	139	0	0	0	152
1DFNA	16254	1.9	0.200	30	0	0	27	28	24	28
1CQMB	16344	1.65	0.198	98	88	88	0	0	0	88
2IGD	15283	1.1	0.197	61	0	0	54	54	50	53
1FD3D	4642	1.35	0.195	41	35	35	0	0	0	0
451C	1333, 10133	1.6	0.195	82	75	73	0	0	0	69
1O5UA	16006	1.83	0.188	88	82	83	82	87	84	82
1RPJA	16984, 16982	1.8	0.188	288	273	0	261	288	263	273
1QG7A	16142	2	0.179	62	58	62	58	62	62	57
1EZGB	5323	1.4	0.179	82	78	74	0	0	0	76
2NWGB	16143	2.07	0.176	64	57	61	57	61	61	55
2GSVB	15350	1.9	0.175	66	63	61	0	65	65	63
1R69	2539	2	0.174	63	60	58	0	0	0	0
2PSPB	2384	1.95	0.170	105	88	94	0	0	0	0
3WRP	17010	1.8	0.167	101	85	0	0	57	53	65
1OS3D	1633	1.95	0.167	28	26	25	0	0	0	0
1QE6C	280	2.35	0.167	67	61	62	0	0	0	0
1WTQA	5905, 5908	1.7	0.167	64	60	0	0	0	0	59
1TUKA	4977	1.12	0.164	67	62	60	0	0	0	61
3ERAB	7211	1.7	0.161	62	53	52	0	0	0	51
2DGCA	1396, 1397, 1398, 1399	2.2	0.159	49	48	48	0	0	0	0
1O82D	4112	1.46	0.157	70	69	60	0	0	0	0
1C8CA	4570	1.45	0.156	64	56	51	0	0	0	0
2CG7A	15756	1.2	0.156	90	83	0	0	88	72	83
1BWOB	2065, 4932, 4383	2.1	0.156	90	84	81	0	0	0	0
2H9EC	4396	2.2	0.155	52	50	48	0	2	4	50
1OMYA	7330	2	0.154	64	59	60	0	0	0	0
1MIDA	15143	1.71	0.154	91	83	73	0	0	0	0
1KBAB	1675	2.3	0.152	66	60	58	0	0	0	0
1L1DB	6051	1.85	0.151	145	113	100	119	125	95	99
1YU8X	15245	1.45	0.149	64	39	40	0	0	0	0
1NAQF	15094	1.7	0.143	105	99	41	104	105	98	104
1GZZB	2498, 4204, 15654	2.3	0.143	60	54	54	57	59	44	50

2A3GA	1442	2.25	0.143	21	19	20	0	0	0	0
1KX9B	5094	1.65	0.143	102	98	95	0	0	0	92
1BNZA	6050	2	0.141	64	51	47	0	0	0	0
1ICFJ	5583	2	0.138	65	58	59	0	0	0	0
1YNRB	10135	2	0.138	79	75	0	0	0	0	72
1GN0A	17136	1.8	0.130	108	103	99	0	108	100	103
1AE3	2039	2	0.128	86	75	72	0	0	0	0
1HB8B	2049	2	0.116	86	82	80	0	0	0	0
1KTZA	4411	2.15	0.116	82	67	74	0	0	0	67
2GM5D	4269	2.1	0.115	114	79	72	78	81	74	79
1CY5A	4661	1.3	0.113	92	86	86	0	84	12	86
1VKBA	16380	1.9	0.112	147	130	132	0	141	116	118
1QVEA	4918	1.54	0.111	126	114	105	0	0	0	108
2GOOB	15956	2.2	0.107	85	76	79	53	66	57	53
1J1VA	5200	2.1	0.106	91	82	72	85	91	87	86
1THQA	6234	1.9	0.100	147	102	0	0	99	75	91
2BEMC	17160	1.55	0.100	170	152	159	168	169	159	152
1ENFA	16146	1.69	0.099	212	204	0	0	200	165	198
1BGF	5997	1.45	0.097	124	111	0	96	104	85	111
1Q2UA	17507	1.6	0.095	189	171	0	178	179	148	157
2UV0H	6271	1.8	0.091	163	150	0	161	161	147	150
1AM7A	16664	2.3	0.089	150	143	126	141	146	0	143
1VYKA	17357	1.49	0.087	129	82	71	91	99	96	93
1JPST	16838	1.85	0.087	200	179	0	177	178	66	160
1XIOA	17064	2	0.084	217	0	0	129	132	97	134
2IM8A	16113, 7227	2	0.084	120	95	104	0	94	90	75
2BDYA	16940	1.61	0.083	276	248	0	0	0	0	0
1ASS	5930	2.3	0.082	152	145	140	133	147	0	140
2Q2TA	16059	2.3	0.072	293	249	0	236	265	235	249
1K82A	5219	2.1	0.071	260	172	0	106	148	95	118
1CKUB	2999	1.2	0.071	85	75	73	0	0	0	0
1PHP	16464, 16451, 16447	1.65	0.063	394	372	0	359	363	325	366
2ASDA	16869	1.95	0.053	341	189	0	187	191	141	189
2GT8A	17251	2	0.042	298	187	185	168	195	161	169
2ILNI	5617	2	0.000	53	47	53	0	0	0	0

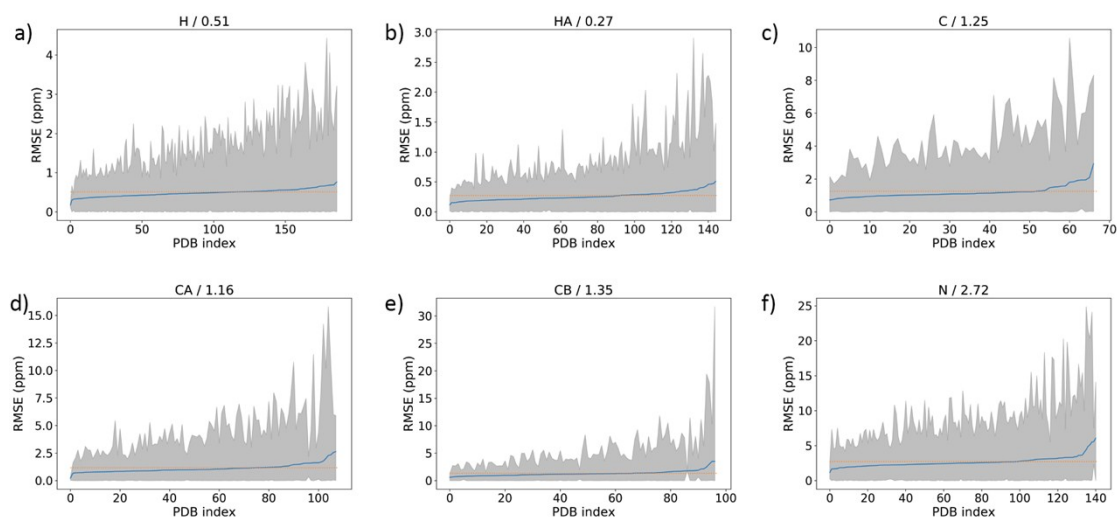
Evaluation of SPARTA+, SHIFTX2 and UCBSHift performance on Test datasets

Table S4. Root mean square error (RMSE), mean squared error (MAE) and Pearson's correlation coefficients (R^2) for UCBSHift in the curated and uncurated test dataset and its low homology subset.

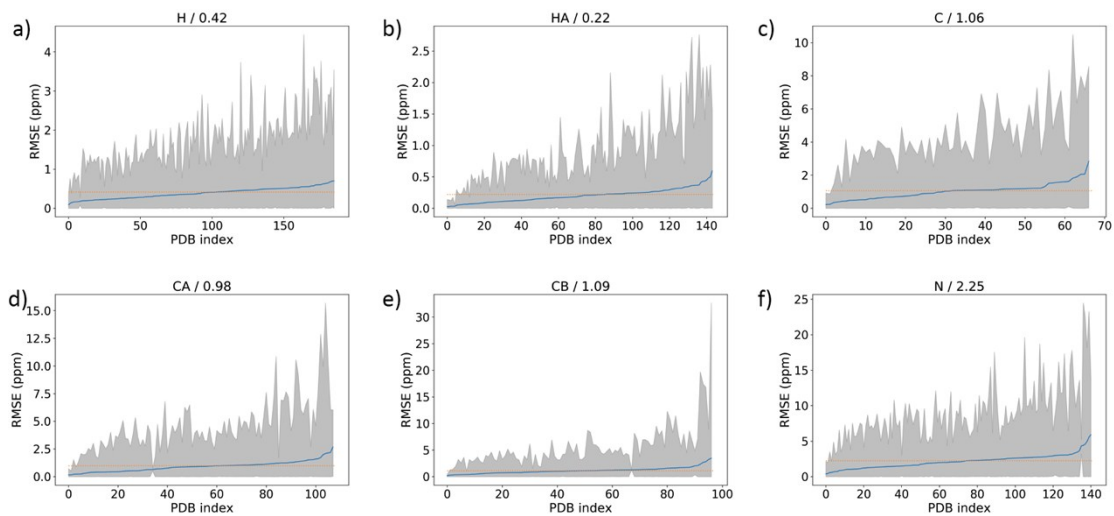
Dataset		Test		LH-Test		
Atom Type	RMSE	MAE	R ²	RMSE	MAE	R ²
H	0.31±0.003	0.18±0.001	0.90	0.45±0.004	0.32±0.001	0.77
H α	0.19±0.002	0.11±0.001	0.94	0.26±0.003	0.18±0.002	0.87
C'	0.84±0.01	0.48±0.004	0.93	1.14±0.01	0.81±0.007	0.86
C α	0.81±0.01	0.43±0.004	0.99	1.09±0.01	0.73±0.005	0.97
C β	1.00±0.03	0.47±0.005	1.00	1.34±0.05	0.83±0.009	0.99
N	1.81±0.02	1.06±0.006	0.95	2.61±0.02	1.89±0.01	0.88
Dataset		Test (Curated)		LH-Test (Curated)		
Atom Type	RMSE	MAE	R ²	RMSE	MAE	R ²
H	0.30±0.002	0.17±0.001	0.90	0.43±0.003	0.32±0.002	0.78
H α	0.18±0.002	0.10±0.001	0.94	0.24±0.003	0.17±0.002	0.88
C'	0.77±0.008	0.44±0.004	0.94	1.13±0.01	0.81±0.006	0.86
C α	0.76±0.009	0.41±0.003	0.99	1.04±0.01	0.71±0.006	0.98
C β	0.82±0.01	0.45±0.004	1.00	1.12±0.02	0.78±0.007	1.00
N	1.71±0.01	1.03±0.008	0.95	2.55±0.02	1.86±0.01	0.88

Figure S2. Error analysis for SPARTA+, SHIFTX2 and UCBSHift. In each graph, the dotted line indicates the average RMSE over all the predicted residues. PDBs are sorted according to the prediction RMSE over that specific structure, and the grey region represents the minimum and maximum RMSE of a single residue in a protein for atom types (a) H, (b) H α , (c) C', (d) C α , (e) C β , and (f) N atom types.

SPARTA+



SHIFTX2



UCBShift

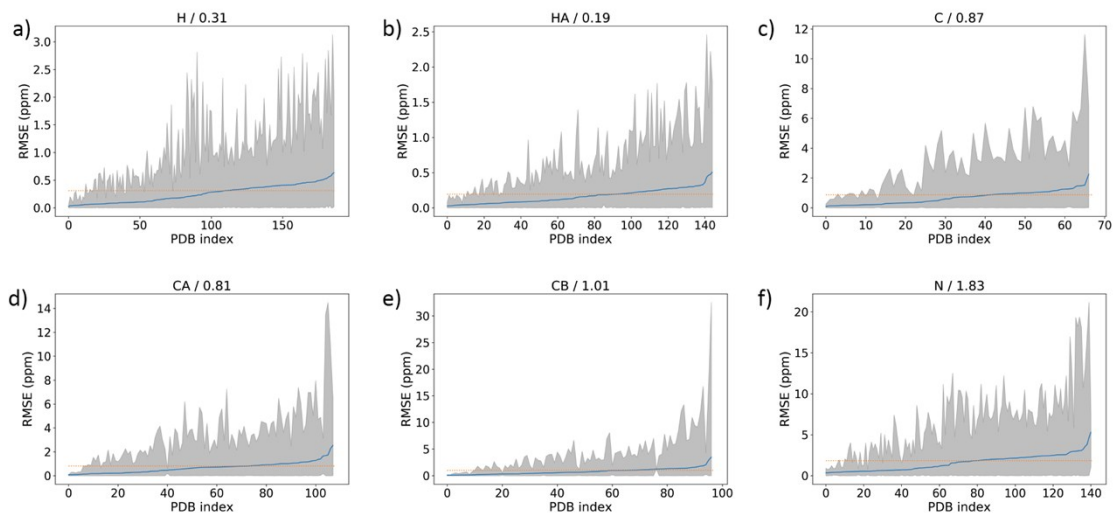
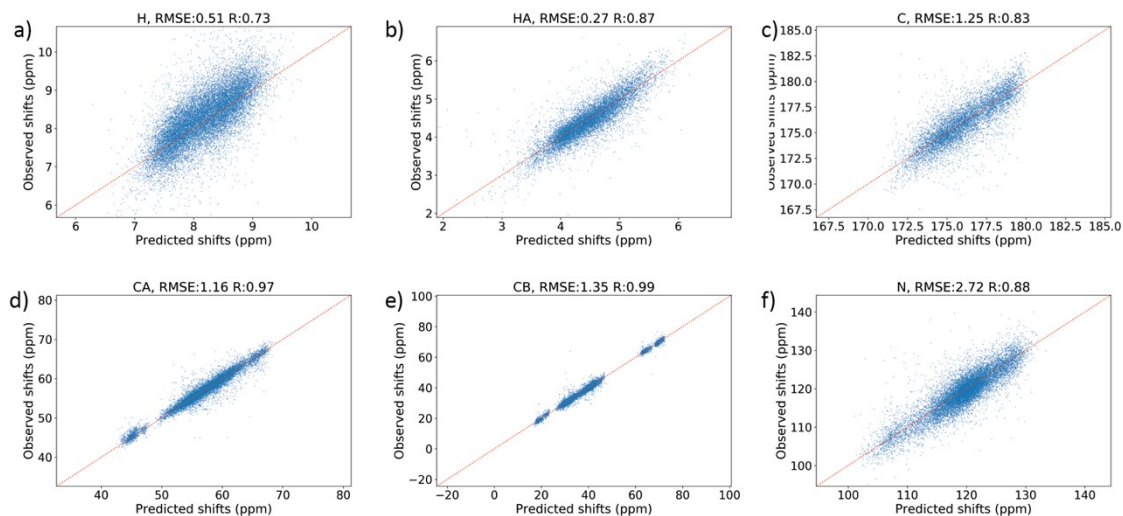
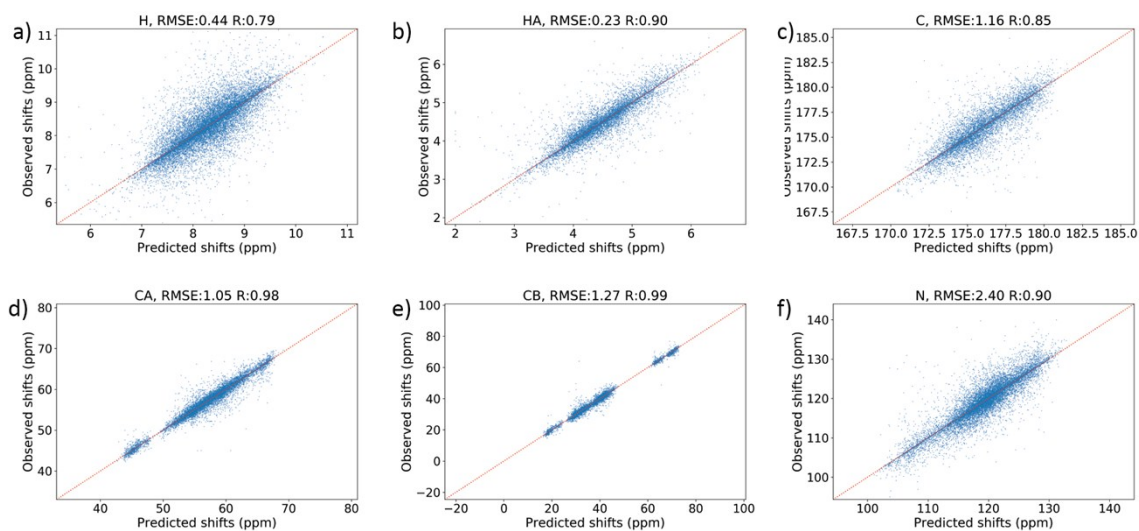


Figure S3. Scatter plot for SPARTA+, SHIFTX2 and UCBSHIFT predictions. The predicted chemical shifts for six atom types plotted with the experimental shifts types (a) H, (b) H α , (c) C', (d) C α , (e) C β , and (f) N atom types.

SPARTA+



SHIFTX2



UCBShift

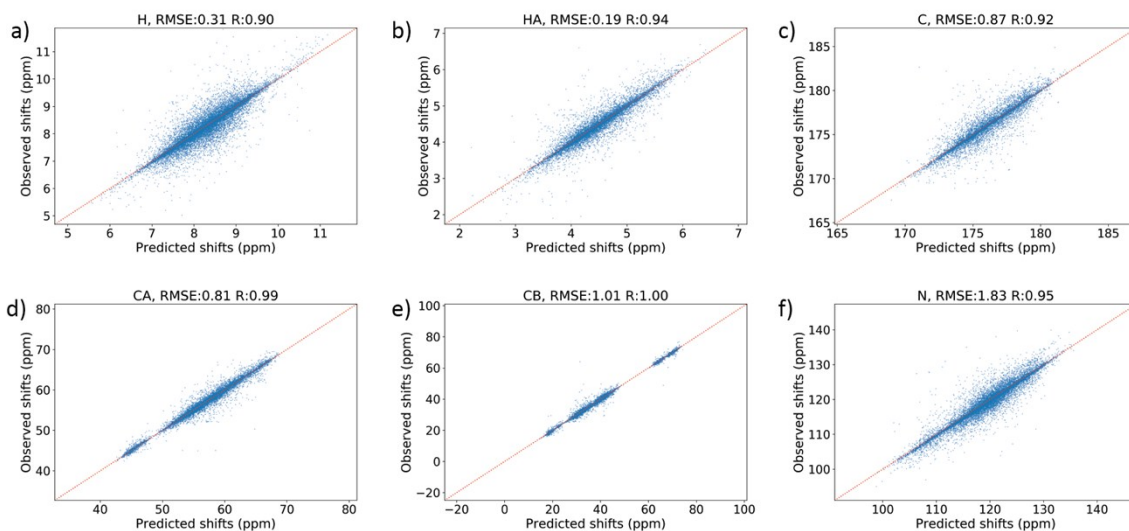
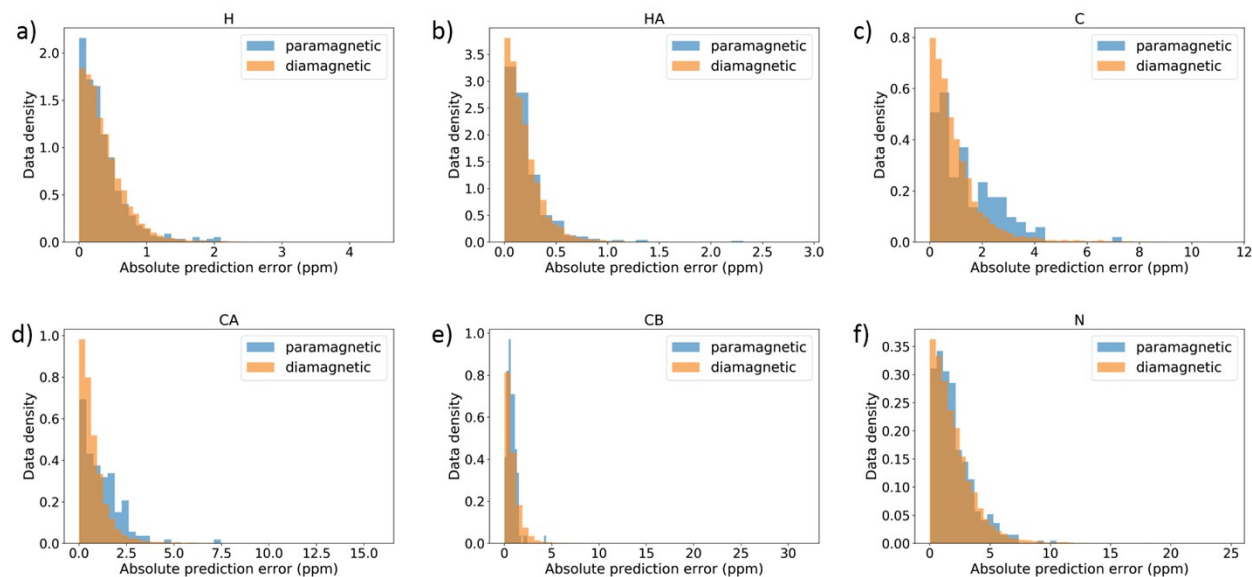


Table S5. Examples of SHIFTX2 that have information leakage from training to test set.

Identifier in training	Identifier in testing	Sequence similarity	Structure RMSD (Å)
R014 3LZTA	A055 1YKYX	100%	0.77
R114 1VDQA	A055 1YKYX	100%	0.41
R020 1RUVA	A001 1KF3A	100%	0.20
R006 2CPLA	A054 1CWCA	98% *	0.21
R129 1ZJLA	A022 1ZJLA	100%	0
R072 3RN3A	A001 1KF3A	100%	0.11

* Training (R006) is a sub-sequence of testing (A054) with 1 aa missing on N-terminus and 2 aa missing on C-terminus

Figure S4. Comparison of absolute error distribution for paramagnetic proteins and diamagnetic proteins based on SPARTA+ predictions. Atom types (a) H, (b) H α , (c) C', (d) C α , (e) C β , and (f) N.



Performance analysis of UCBSHIFT-Y in comparison with SHIFTY+

Figure S5. Difference between UCBSHIFT-Y and SHIFTY+ for protein specific RMSEs for different atom types as a function of sequence identity. Atom types (a) H, (b) H α , (c) C', (d) C α , (e) C β , and (f) N.

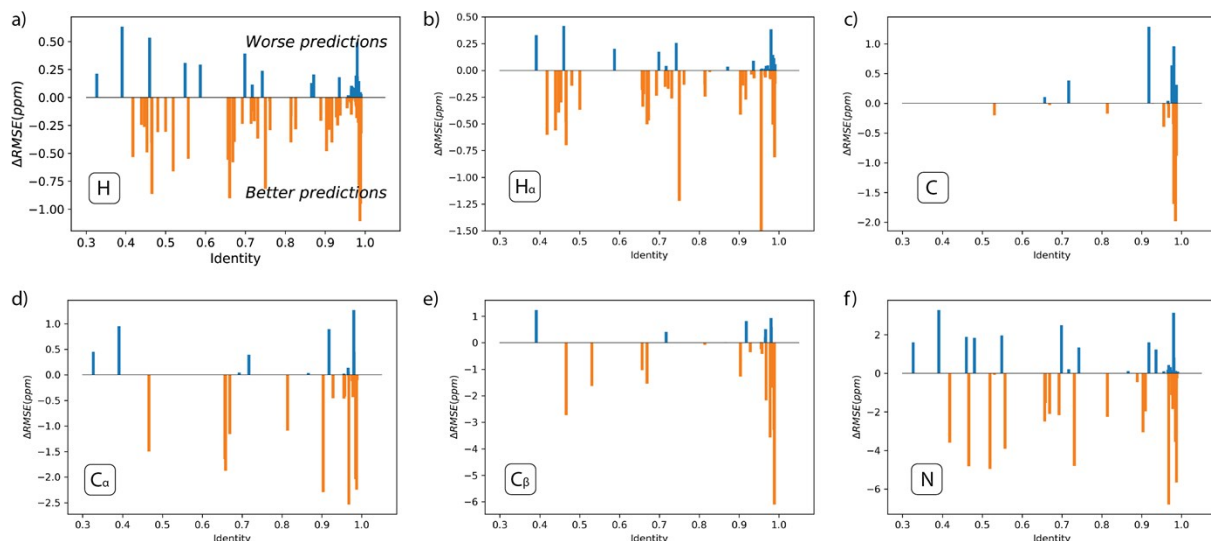
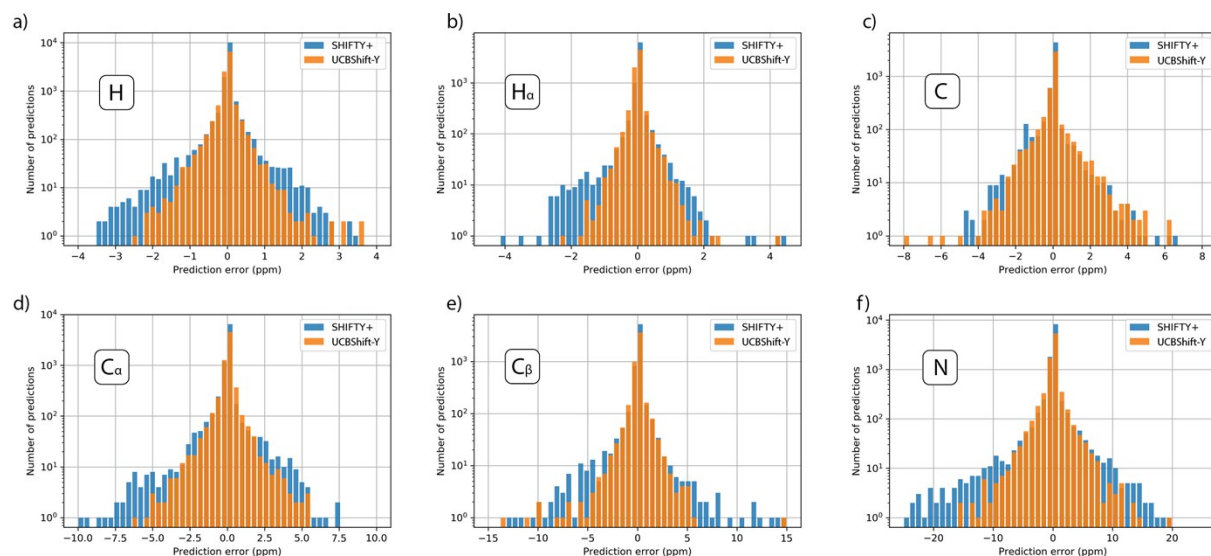


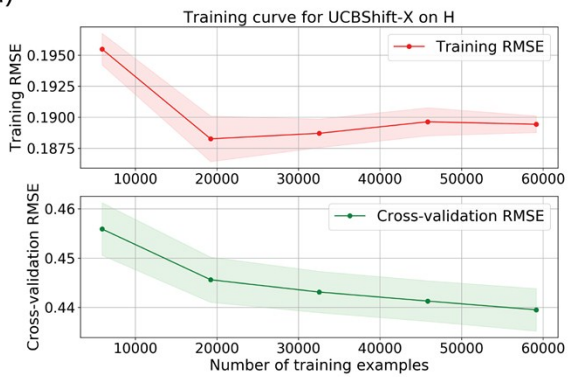
Figure S6. Error distributions for UCBSHIFT-Y and SHIFTY+ across all atom types. This compares only the transfer prediction module of UCBSHIFT (UCBSHIFT-Y) which uses sequence and structural alignment.



Learning curves for random forest models

Figure S7. Learning curves for $R1$ and $R2$ in *UCBShift-X* module for hydrogen.

a)



b)

