

In Ledig et al. [1], the normalization coefficients for the correction for nuisance factors were calculated on all analyzed healthy control subjects. This allows consistent feature correction across all experiments and simplifies statistical group comparison. We have confirmed that the simpler correction approach we took does not cause any substantial quantitative differences in our experiments. Specifically, we confirmed that quantitative differences in the calculated statistics are negligible when calculating normalization coefficients based on either the healthy control group (c.f. Table 2) or the stable MCI group (c.f. Table 3). Both normalization approaches yield a substantial improvement over uncorrected features (c.f. Table 1).

References

1. Ledig, C., Schuh, A., Guerrero, R., Heckemann, R. A. & Rueckert, D. Structural brain imaging in Alzheimer's disease and mild cognitive impairment: biomarker analysis and shared morphometry database. *Sci. Reports* (2018).

Cross-sectional analysis at baseline (AD vs. HC, uncorrected volumes)

Table 1. Classification results in % (6-fold CV, LDA 100 runs, RF/SVM 20 runs) for distinguishing between AD and HC. Significant group differences indicated by + ($p < 0.05$) and ++ ($p < 0.001$). Bonferroni-corrected significance in parentheses. Sorted by effect size.

AD patients (N = 322, Positives ^P) vs. Healthy Controls (N = 404, Negatives ^N) (baseline analysis, uncorrected volumes)									
structure	ACC (bACC)	SENS	SPEC	mean (SD) [mm ³] ^P	mean (SD) [mm ³] ^N	effect size (d)	p-value	sig. (corr.)	
RandomForest (all features)	85 (85)	81	88						
SVM (all features)	90 (90)	86	93						
Gender (female = 0, male = 1)	52 (52)	55	50	0.5 (0.5)	0.5 (0.5)	0.099	0.18349	o (o)	
Age	51 (51)	51	51	75.1 (7.7)	74.9 (5.7)	0.027	0.71340	o (o)	
(surrogate structures)									
Ventricles	66 (65)	55	75	63295.6 (28189.0)	46227.4 (20971.9)	0.698	<0.00001	++ (++)	
CorticalGreyMatter	61 (61)	62	60	491782.0 (56040.1)	519904.6 (50579.3)	0.530	<0.00001	++ (++)	
BrainTissue	56 (56)	57	55	1133344.3 (1183269.9)	1163549.9 (110731.1)	0.265	0.00042	++ (++)	
DeepGreyMatter	55 (55)	57	54	172879.2 (18868.2)	175625.6 (16551.2)	0.156	0.03725	+ (o)	
Brain	54 (55)	56	53	1199158.5 (132290.9)	1212115.6 (118623.9)	0.104	0.16526	o (o)	
WhiteMatter	48 (47)	47	48	468683.1 (62373.7)	468019.7 (118538.5)	0.011	0.88497	o (o)	
(individual structures)									
LeftHippocampus	76 (76)	76	75	2608.0 (479.7)	3221.8 (434.3)	1.349	<0.00001	++ (++)	
Amygdala	75 (75)	73	78	1825.9 (388.6)	2296.6 (314.5)	1.348	<0.00001	++ (++)	
Hippocampus	75 (75)	75	75	5429.2 (943.8)	6601.4 (825.8)	1.332	<0.00001	++ (++)	
RightAmygdala	75 (75)	73	76	925.6 (209.5)	1168.0 (171.6)	1.280	<0.00001	++ (++)	
EntA	73 (73)	71	75	3427.5 (675.5)	4245.4 (609.2)	1.279	<0.00001	++ (++)	
LeftAmygdala	75 (75)	73	77	900.3 (205.1)	1128.6 (162.7)	1.250	<0.00001	++ (++)	
RightHippocampus	73 (73)	71	75	2821.2 (546.5)	3379.6 (427.4)	1.154	<0.00001	++ (++)	
InfLatVent	73 (72)	58	85	3432.1 (1556.1)	2107.1 (825.3)	1.099	<0.00001	++ (++)	
LeftInfLatVent	75 (74)	63	85	1652.9 (765.4)	1006.8 (420.7)	1.079	<0.00001	++ (++)	
RightInfLatVent	70 (68)	55	82	1779.3 (902.2)	1100.3 (447.5)	0.988	<0.00001	++ (++)	
ITG	66 (66)	66	65	21776.6 (3325.8)	24529.3 (2916.2)	0.887	<0.00001	++ (++)	
PHG	66 (66)	68	65	6447.4 (977.5)	7217.3 (899.2)	0.824	<0.00001	++ (++)	
Ang	67 (67)	67	67	15507.5 (2580.5)	17559.5 (4808.9)	0.812	<0.00001	++ (++)	
MTG	64 (64)	66	62	25677.9 (4030.6)	28518.5 (3713.2)	0.735	<0.00001	++ (++)	
TMP	64 (63)	61	65	13730.4 (2468.4)	15339.5 (2004.0)	0.724	<0.00001	++ (++)	
LateralVentricle	65 (64)	55	73	55184.7 (26190.1)	39883.0 (19481.1)	0.674	<0.00001	++ (++)	
LeftLateralVentricle	66 (65)	55	75	29062.5 (14264.5)	20827.4 (10483.3)	0.669	<0.00001	++ (++)	
SMG	62 (63)	64	61	13731.4 (2077.6)	15086.0 (2006.8)	0.664	<0.00001	++ (++)	
RightLateralVentricle	63 (62)	54	71	26122.3 (12557.2)	19055.6 (9403.3)	0.647	<0.00001	++ (++)	
STG	63 (63)	62	63	12671.1 (2031.8)	13889.0 (1933.7)	0.616	<0.00001	++ (++)	
OfUG	60 (60)	61	60	7382.1 (1324.3)	8129.7 (1267.7)	0.578	<0.00001	++ (++)	
ThalamusProper	61 (61)	63	60	12486.4 (1477.5)	13034.8 (1426.0)	0.565	<0.00001	++ (++)	
3rdVentricle	60 (60)	54	65	2319.7 (828.7)	1891.2 (721.5)	0.556	<0.00001	++ (++)	
BasalForebrain	62 (62)	64	60	795.6 (215.5)	914.0 (213.2)	0.552	<0.00001	++ (++)	
FuG	60 (61)	63	59	15951.4 (2428.3)	17131.2 (2281.3)	0.503	<0.00001	++ (++)	
Alns	62 (62)	63	60	8241.7 (1225.1)	8820.0 (1142.4)	0.490	<0.00001	++ (++)	
AccumbensArea	60 (60)	57	62	617.0 (184.6)	695.7 (148.3)	0.475	<0.00001	++ (++)	
MOG	59 (59)	61	57	10087.5 (1773.4)	10837.5 (1524.1)	0.457	<0.00001	++ (++)	
IOG	58 (58)	57	59	11413.2 (2016.2)	12233.2 (1815.4)	0.430	<0.00001	++ (++)	
SPL	58 (58)	59	57	16943.2 (2469.3)	17977.7 (2441.6)	0.422	<0.00001	++ (++)	
Pls	58 (59)	60	57	4482.8 (701.8)	4771.4 (703.1)	0.411	<0.00001	++ (++)	
PP	58 (58)	60	55	3682.5 (589.7)	3912.8 (549.4)	0.406	<0.00001	++ (++)	
FO	57 (57)	58	55	3504.1 (549.2)	3718.8 (539.9)	0.395	<0.00001	++ (++)	
MFG	59 (59)	60	59	33109.0 (5125.3)	34968.2 (4791.0)	0.376	<0.00001	++ (++)	
SFG	56 (57)	58	55	26326.6 (3837.4)	27676.8 (3441.8)	0.373	<0.00001	++ (++)	
PT	57 (57)	61	54	3658.7 (712.6)	3926.4 (769.4)	0.359	<0.00001	++ (++)	
TrIFG	54 (54)	55	54	6113.5 (1082.3)	6494.0 (1071.5)	0.354	<0.00001	++ (++)	
Caudate	38 (56)	43	69	7535.3 (2705.8)	6812.7 (1705.2)	0.328	0.00001	++ (+)	
Putamen	56 (56)	57	55	7455.9 (1342.8)	7878.8 (1331.8)	0.316	0.00003	++ (+)	
SCA	56 (57)	58	55	2367.0 (496.3)	2510.7 (434.7)	0.310	0.00004	++ (+)	
PCu	55 (56)	58	53	21742.5 (3583.1)	22743.6 (3039.0)	0.304	0.00005	++ (+)	
PCG	56 (56)	57	55	8494.1 (1311.2)	8862.3 (1128.5)	0.304	0.00005	++ (+)	
CSF	57 (56)	51	61	2419.4 (579.6)	2250.7 (598.6)	0.286	0.00014	++ (+)	
POrg	55 (55)	57	54	6068.4 (927.5)	6312.4 (859.2)	0.274	0.00026	++ (+)	
MCgG	55 (54)	48	60	10326.5 (1674.5)	9905.0 (1511.3)	0.266	0.00040	++ (+)	
MSFG	56 (57)	61	53	12685.2 (2000.5)	13151.5 (1735.4)	0.251	0.00082	++ (o)	
SOG	55 (55)	57	54	7063.8 (1242.6)	7354.8 (1136.5)	0.246	0.00106	+ (o)	
MFC	54 (54)	54	54	3510.2 (716.9)	3663.4 (603.6)	0.233	0.00185	+ (o)	
OCP	53 (53)	57	50	4494.6 (931.2)	4728.0 (1076.0)	0.230	0.00215	+ (o)	
CerebellarVermalLobulesI-V	54 (54)	56	52	4464.0 (672.4)	4616.9 (672.9)	0.227	0.00244	+ (o)	
OrlFG	55 (55)	60	50	2749.4 (587.8)	2879.5 (568.2)	0.225	0.00263	+ (o)	
LOrG	54 (55)	57	52	3713.5 (688.9)	3853.3 (601.1)	0.218	0.00363	+ (o)	
OpIFG	52 (53)	57	49	5649.2 (1036.1)	5864.9 (1065.5)	0.205	0.00624	+ (o)	
GR	53 (53)	55	52	3228.0 (549.0)	3335.1 (512.8)	0.202	0.00691	+ (o)	
PO	54 (55)	58	52	4251.3 (792.1)	4409.9 (796.3)	0.200	0.00770	+ (o)	
CerebellumWhiteMatter	54 (52)	40	65	32795.7 (8328.0)	31344.3 (7506.8)	0.184	0.01393	+ (o)	
SMC	53 (53)	57	49	10285.9 (1713.6)	10567.8 (1418.9)	0.181	0.01558	+ (o)	
AOrG	51 (51)	52	50	3804.7 (617.0)	3906.9 (598.1)	0.168	0.02448	+ (o)	
TTG	56 (57)	62	52	2387.0 (557.6)	2477.1 (532.0)	0.166	0.02684	+ (o)	
CerebellarVermalLobulesVI-VII	53 (53)	50	55	2417.3 (432.6)	2355.7 (390.0)	0.150	0.04435	+ (o)	
PoG	53 (53)	55	51	18093.5 (2551.3)	18449.6 (2321.8)	0.147	0.04984	+ (o)	
MPoG	54 (54)	56	52	1644.7 (394.0)	1699.2 (370.6)	0.143	0.05604	o (o)	
PrG	52 (52)	53	51	23676.0 (3462.6)	24096.7 (3052.7)	0.130	0.08266	o (o)	
CO	53 (53)	55	51	7785.8 (1114.5)	7923.9 (1090.1)	0.125	0.09374	o (o)	
Calc	53 (53)	50	55	7085.9 (1722.2)	6884.2 (1531.2)	0.125	0.09586	o (o)	
FRP	51 (52)	53	50	5444.2 (1113.1)	5565.8 (996.7)	0.116	0.12123	o (o)	
MPtG	53 (53)	55	51	5428.2 (957.0)	5531.1 (847.0)	0.115	0.12515	o (o)	
MoRG	52 (52)	54	51	8243.5 (1150.7)	8361.5 (1010.3)	0.110	0.14236	o (o)	
ACg	51 (51)	54	49	8487.7 (1576.8)	8613.8 (1458.5)	0.083	0.26466	o (o)	
VentralIDC	51 (51)	52	50	8448.8 (965.4)	8523.1 (931.8)	0.079	0.29369	o (o)	
BrainStem	50 (50)	52	49	18742.3 (2233.9)	18885.5 (2141.8)	0.066	0.38005	o (o)	
Pallidum	51 (51)	49	52	2668.2 (454.5)	2645.4 (394.7)	0.054	0.47061	o (o)	
Cun	49 (49)	49	48	10691.9 (2079.7)	10753.0 (1794.8)	0.032	0.67110	o (o)	
CerebellarVermalLobulesVIII-X	48 (48)	47	49	2823.6 (474.2)	2814.5 (428.5)	0.020	0.78685	o (o)	
4thVentricle	48 (48)	45	51	2359.0 (691.3)	2346.0 (690.8)	0.019	0.80132	o (o)	
CerebralWhiteMatter	48 (48)	49	48	43588.7 (58972.0)	43667.5 (56880.4)	0.014	0.85528	o (o)	
CerebellumExterior	48 (48)	48	49	97168.8 (12890.5)	97279.6 (11151.4)	0.009	0.90128	o (o)	
LiG	48 (48)	47	48	18512.9 (2794.7)	18524.4 (2476.3)	0.004	0.95334	o (o)	

Cross-sectional analysis at baseline (AD vs. HC, corrected volumes based on HC group)

Table 2. Classification results in % (6-fold CV, LDA 100 runs, RF/SVM 20 runs) for distinguishing between AD and HC. Significant group differences indicated by + ($p < 0.05$) and ++ ($p < 0.001$). Bonferroni-corrected significance in parentheses. Sorted by effect size. Mean also shown in % with respect to sample-specific reference volume used for feature correction.

AD patients (N = 322, Positives ^P) vs. Healthy Controls (N = 404, Negatives ^N) (baseline analysis, [†] volumes corrected for age/gender/brain size)		structure	ACC (bACC)	SENS	SPEC	mean [rel. to HC] (SD) [mm ³] ^{P,N}	mean (SD) [mm ³] ^{N,P}	effect size (d)	p-value	sig. (corr.)
RandomForest (all features)		87 (86)	83	90						
SVM (all features)		90 (89)	86	92						
Gender (female = 0, male = 1)		52 (52)	55	50		0.5 (0.5)	0.5 (0.5)	0.099	0.18349	o (o)
Age		50 (50)	50	50		75.1 (7.7)	74.9 (5.7)	0.027	0.71340	o (o)
(surrogate structures)										
BrainTissue		72 (71)	63	78	-17942.8 [$\pm -1.5\%$] (22718.7)	0 (17403.6)	0.900	<0.00001	++ (++)	
CorticalGreyMatter		68 (67)	63	72	-23635.9 [$\pm -4.6\%$] (28907.3)	0 (24078.1)	0.898	<0.00001	++ (++)	
Ventricles		72 (71)	63	79	17757.3 [$\pm -46.2\%$] (22639.6)	0 (17293.9)	0.895	<0.00001	++ (++)	
WhiteMatter		57 (56)	51	61	7242.2 [$\pm -1.7\%$] (29309.8)	0 (28686.1)	0.250	0.00086	++ (o)	
DeepGreyMatter		52 (52)	50	54	-1549.1 [$\pm -0.9\%$] (13310.3)	0 (11142.2)	0.127	0.08834	o (o)	
Brain		54 (55)	56	53	1199158.5 (132290.9)	1212115.6 (118623.9)	0.104	0.16526	o (o)	
(individual structures)										
Amygdala		80 (80)	76	84	-452.0 [$\pm -20.0\%$] (332.0)	0 (250.5)	1.561	<0.00001	++ (++)	
Hippocampus		78 (78)	75	80	-11154.0 [$\pm -17.0\%$] (817.7)	0 (660.7)	1.519	<0.00001	++ (++)	
EntA		78 (78)	76	80	-801.3 [$\pm -19.0\%$] (583.3)	0 (485.3)	1.509	<0.00001	++ (++)	
LeftHippocampus		79 (78)	76	81	-588.1 [$\pm -18.4\%$] (423.1)	0 (364.6)	1.502	<0.00001	++ (++)	
RightAmygdala		80 (80)	77	83	-2322.2 [$\pm -20.2\%$] (182.6)	0 (139.4)	1.452	<0.00001	++ (++)	
LeftAmygdala		78 (78)	75	81	-219.8 [$\pm -19.7\%$] (179.7)	0 (135.5)	1.403	<0.00001	++ (++)	
RightHippocampus		76 (75)	71	79	-527.3 [$\pm -15.7\%$] (488.0)	0 (339.1)	1.280	<0.00001	++ (++)	
InflLatVent		78 (77)	65	89	1330.8 [$\pm -65.8\%$] (1367.4)	0 (702.2)	1.267	<0.00001	++ (++)	
LeftInflLatVent		77 (76)	66	86	649.5 [$\pm -68.2\%$] (677.1)	0 (360.6)	1.237	<0.00001	++ (++)	
ITG		71 (71)	69	73	-2588.0 [$\pm -10.7\%$] (2506.9)	0 (1954.5)	1.168	<0.00001	++ (++)	
RightInflLatVent		75 (73)	59	87	681.3 [$\pm -63.6\%$] (814.9)	0 (391.3)	1.106	<0.00001	++ (++)	
PHG		68 (68)	64	72	-739.8 [$\pm -10.3\%$] (632.6)	0 (702.4)	0.970	<0.00001	++ (++)	
MTG		69 (69)	69	70	-2534.0 [$\pm -9.0\%$] (2853.0)	0 (2411.3)	0.969	<0.00001	++ (++)	
Ang		68 (67)	65	70	-1800.5 [$\pm -10.6\%$] (2245.6)	0 (1973.2)	0.876	<0.00001	++ (++)	
TMP		66 (65)	64	67	1521.7 [$\pm -10.1\%$] (1967.2)	0 (1539.3)	0.873	<0.00001	++ (++)	
LateralVentricle		71 (70)	62	78	15972.2 [$\pm -50.5\%$] (21196.2)	0 (16214.4)	0.859	<0.00001	++ (++)	
LeftLateralVentricle		70 (69)	61	76	8584.7 [$\pm -51.4\%$] (11586.9)	0 (8816.1)	0.847	<0.00001	++ (++)	
RightLateralVentricle		70 (69)	59	78	7387.5 [$\pm -49.6\%$] (10387.1)	0 (7883.2)	0.814	<0.00001	++ (++)	
STG		65 (65)	64	66	-1100.3 [$\pm -7.9\%$] (1610.7)	0 (1478.6)	0.715	<0.00001	++ (++)	
3rdVentricle		67 (66)	63	70	434.4 [$\pm -27.9\%$] (699.9)	0 (591.1)	0.677	<0.00001	++ (++)	
SMG		64 (64)	63	65	-1196.5 [$\pm -7.8\%$] (2003.1)	0 (1697.8)	0.650	<0.00001	++ (++)	
ThalamusProper		63 (63)	61	65	-6806.1 [$\pm -5.0\%$] (1214.1)	0 (1005.2)	0.617	<0.00001	++ (++)	
FuG		62 (62)	62	61	-1072.1 [$\pm -6.4\%$] (1750.6)	0 (1769.3)	0.609	<0.00001	++ (++)	
OFuG		60 (60)	58	62	-6907.7 [$\pm -8.4\%$] (1225.8)	0 (1061.2)	0.607	<0.00001	++ (++)	
BasalForebrain		63 (63)	66	61	-1049.6 [$\pm -12.0\%$] (195.4)	0 (189.6)	0.571	<0.00001	++ (++)	
Alns		59 (60)	62	58	-509.3 [$\pm -5.8\%$] (995.9)	0 (915.4)	0.535	<0.00001	++ (++)	
MOG		60 (60)	61	59	-643.3 [$\pm -6.1\%$] (1375.1)	0 (1195.7)	0.503	<0.00001	++ (++)	
IOG		59 (59)	60	59	-697.2 [$\pm -5.8\%$] (1571.8)	0 (1386.2)	0.474	<0.00001	++ (++)	
AccumbensArea		60 (60)	59	61	-71.7 [$\pm -10.3\%$] (177.2)	0 (138.5)	0.457	<0.00001	++ (++)	
PP		58 (58)	61	56	-200.0 [$\pm -5.2\%$] (464.5)	0 (433.4)	0.447	<0.00001	++ (++)	
MCzG		58 (57)	54	60	544.3 [$\pm -5.6\%$] (1270.6)	0 (1190.1)	0.444	<0.00001	++ (++)	
PlNs		58 (58)	58	58	-231.1 [$\pm -4.9\%$] (524.6)	0 (547.9)	0.430	<0.00001	++ (++)	
MPFG		58 (58)	56	60	-1467.9 [$\pm -4.2\%$] (3689.2)	0 (3194.1)	0.429	<0.00001	++ (++)	
SPL		56 (56)	57	56	-867.5 [$\pm -4.7\%$] (2175.8)	0 (1972.5)	0.420	<0.00001	++ (++)	
SFG		59 (59)	60	58	-1124.3 [$\pm -4.1\%$] (3032.2)	0 (2632.7)	0.399	<0.00001	++ (++)	
Caudate		58 (57)	46	68	799.5 [$\pm -11.2\%$] (2447.8)	0 (1597.5)	0.396	<0.00001	++ (++)	
FO		60 (60)	59	60	-187.3 [$\pm -4.9\%$] (506.5)	0 (458.7)	0.390	<0.00001	++ (++)	
PT		56 (56)	58	55	-232.4 [$\pm -5.8\%$] (590.0)	0 (636.4)	0.377	<0.00001	++ (++)	
TrIFG		57 (57)	56	58	-331.8 [$\pm -5.0\%$] (985.1)	0 (933.4)	0.347	<0.00001	++ (++)	
PCu		56 (56)	57	54	-788.1 [$\pm -3.6\%$] (2502.1)	0 (2124.3)	0.343	<0.00001	++ (++)	
PCzG		57 (57)	59	56	-306.1 [$\pm -3.7\%$] (960.5)	0 (898.4)	0.330	0.00001	++ (++)	
SCA		58 (58)	58	59	-124.5 [$\pm -5.1\%$] (441.7)	0 (388.6)	0.301	0.00006	++ (++)	
PoG		57 (57)	54	59	-211.0 [$\pm -3.4\%$] (738.1)	0 (685.9)	0.297	0.00008	++ (++)	
CSF		58 (58)	53	62	172.5 [$\pm -9.3\%$] (621.2)	0 (545.8)	0.297	0.00008	++ (++)	
Putamen		57 (57)	58	56	-367.5 [$\pm -4.6\%$] (1300.2)	0 (1243.1)	0.290	0.00012	++ (++)	
MSFG		54 (54)	55	53	-349.9 [$\pm -2.8\%$] (1447.4)	0 (1334.5)	0.253	0.00076	++ (o)	
MFC		53 (53)	54	53	-123.9 [$\pm -3.6\%$] (577.8)	0 (493.6)	0.233	0.00192	+ (o)	
CerebellumWhiteMatter		55 (54)	44	64	1677.9 [$\pm -5.8\%$] (7982.2)	0 (6947.8)	0.226	0.00257	+ (o)	
OCP		53 (54)	57	50	-207.2 [$\pm -4.5\%$] (815.9)	0 (999.5)	0.225	0.00274	+ (o)	
SOG		55 (56)	58	53	-220.0 [$\pm -3.1\%$] (1044.7)	0 (974.8)	0.219	0.00354	+ (o)	
CerebralWhiteMatter		56 (55)	52	58	5564.3 [$\pm -14.0\%$] (26392.1)	0 (25736.3)	0.214	0.00434	+ (o)	
OrIFG		55 (56)	59	52	-109.5 [$\pm -3.9\%$] (518.0)	0 (510.3)	0.213	0.00446	+ (o)	
LOG		52 (52)	53	51	-111.8 [$\pm -3.0\%$] (565.6)	0 (492.2)	0.213	0.00456	+ (o)	
TTG		54 (54)	56	53	-71.6 [$\pm -1.8\%$] (483.0)	0 (464.7)	0.151	0.04301	+ (o)	
MPoG		53 (53)	53	53	-70.4 [$\pm -2.7\%$] (481.9)	0 (455.3)	0.151	0.04398	+ (o)	
PrG		52 (53)	55	50	-262.1 [$\pm -1.1\%$] (2723.4)	0 (2472.1)	0.101	0.17534	o (o)	
Palldiduum		54 (54)	55	53	-38.0 [$\pm -1.4\%$] (418.7)	0 (362.0)	0.098	0.19090	o (o)	
PoG		52 (52)	52	52	-189.2 [$\pm -1.0\%$] (2124.4)	0 (1913.6)	0.094	0.20803	o (o)	
FRP		50 (50)	53	47	-76.0 [$\pm -1.5\%$] (662.3)	0 (901.5)	0.082	0.27406	o (o)	
MPFG		51 (51)	53	50	-58.2 [$\pm -1.1\%$] (819.9)	0 (747.4)	0.075	0.31847	o (o)	
CO		50 (50)	51	49	-58.3 [$\pm -0.7\%$] (783.8)	0 (796.8)	0.074	0.32384	o (o)	
MoG		51 (51)	53	49	-161.3 [$\pm -0.7\%$] (943.0)	0 (819.7)	0.070	0.34945	o (o)	
CerebellarVermalLobulesVII-X		51 (51)	51	51	22.1 [$\pm 0.8\%$] (423.1)	0 (375.1)	0.056	0.45705	o (o)	
LIG		51 (51)	51	51	106.4 [$\pm 0.5\%$] (2022.0)	0 (1846.7)	0.055	0.46010	o (o)	
CerebellumExterior		52 (52)	52	51	442.1 [$\pm 0.4\%$] (10408.6)	0 (8931.0)	0.046	0.53842	o (o)	
4thVentricle		50 (50)	46	54	19.9 [$\pm 1.1\%$] (646.4)	0 (643.3)	0.031	0.67923	o (o)	
Cun		48 (48)	46	49	33.2 [$\pm 0.2\%$] (1619.0)	0 (1403.3)	0.022	0.76765	o (o)	
VentralDC		47 (47)	46	47	-13.7 [$\pm -0.0\%$] (709.3)	0 (597.0)	0.021	0.77728	o (o)	
BrainStem		48 (48)	47	48	17.8 [$\pm 0.2\%$] (1574.8)	0 (1484.5)	0.012	0.87624	o (o)	
ACg		47 (47)	47	48	-5.9 [$\pm -0.0\%$] (1178.5)	0 (1101.8)	0.005	0.94417	o (o)	

Cross-sectional analysis at baseline (AD vs. HC, corrected volumes based on sMCI group)

Table 3. Classification results in % (6-fold CV, LDA 100 runs, RF/SVM 20 runs) for distinguishing between AD and HC. Significant group differences indicated by + ($p < 0.05$) and ++ ($p < 0.001$). Bonferroni-corrected significance in parentheses. Sorted by effect size. Mean also shown in % with respect to sample-specific reference volume used for feature correction.

AD patients (N = 322, Positives ^P) vs. Healthy Controls (N = 404, Negatives ^N) (baseline analysis, ^T volumes corrected for age/gender/brain size)								
structure	ACC (bACC)	SENS	SPEC	mean [rel. to HC] (SD) [mm ³] ^{P,N}	mean (SD) [mm ³] ^N	effect size (d)	p-value	sig. (corr.)
RandomForest (all features)	87 (86)	83	89					
SVM (all features)	89 (89)	86	92					
Gender (female = 0, male = 1)	52 (52)	55	50	0.5 [$\pm 0.5\%$] (0.5)	0.5 [$\pm 0.5\%$] (0.5)	0.099	0.18349	o (o)
Age	51 (51)	51	51	75.1 [$\pm 75.1\%$] (7.7)	74.9 [$\pm 74.9\%$] (5.7)	0.027	0.71340	o (o)
(surrogate structures)								
BrainTissue	72 (71)	63	78	-13725.4 [$\pm 1.2\%$] (22678.2)	4317.4 [$\pm 0.4\%$] (17492.6)	0.904	<0.00001	++ (++)
CorticalGreyMatter	67 (67)	62	71	-17169.5 [$\pm 3.4\%$] (29114.1)	6737.0 [$\pm 1.3\%$] (24174.3)	0.903	<0.00001	++ (++)
Ventricles	72 (71)	63	78	13491.8 [$\pm 3.7\%$] (22540.4)	-4744.9 [$\pm 0.8\%$] (14975.7)	0.903	<0.00001	++ (++)
WhiteMatter	57 (56)	51	61	36000.1 [$\pm 1.0\%$] (106.5)	-4260.7 [$\pm 0.9\%$] (887.6)	0.254	0.00071	++ (o)
DeepGreyMatter	52 (52)	50	54	364.2 [$\pm 0.4\%$] (13220.9)	1406.2 [$\pm 1.1\%$] (11183.0)	0.124	0.09805	o (o)
Brain	54 (55)	56	53	1199158.5 [$\pm 1199158.5\%$] (132290.9)	1212115.6 [$\pm 1212115.6\%$] (118623.9)	0.104	0.16562	o (o)
(individual structures)								
Amygdala	80 (80)	76	83	-313.0 [$\pm 14.7\%$] (335.6)	149.5 [$\pm 7.0\%$] (256.6)	1.572	<0.00001	++ (++)
Hippocampus	77 (77)	76	78	-562.6 [$\pm 9.4\%$] (830.8)	596.7 [$\pm 10.0\%$] (694.7)	1.529	<0.00001	++ (++)
EntA	79 (79)	76	82	-536.9 [$\pm 13.6\%$] (585.5)	285.6 [$\pm 7.2\%$] (497.5)	1.528	<0.00001	++ (++)
LeftHippocampus	77 (77)	75	79	-294.5 [$\pm 10.1\%$] (430.7)	312.2 [$\pm 10.8\%$] (376.9)	1.510	<0.00001	++ (++)
RightAmygdala	79 (79)	76	82	-157.3 [$\pm 14.5\%$] (184.5)	81.7 [$\pm 7.7\%$] (143.5)	1.464	<0.00001	++ (++)
LeftAmygdala	79 (78)	74	82	-155.1 [$\pm 14.9\%$] (191.8)	67.8 [$\pm 6.4\%$] (188.1)	1.406	<0.00001	++ (++)
RightHippocampus	75 (74)	70	79	-268.4 [$\pm 8.4\%$] (391.8)	264.2 [$\pm 8.4\%$] (379.5)	1.395	<0.00001	++ (++)
LeftLatVent	79 (78)	68	88	1019.9 [$\pm 7.8\%$] (1360.9)	-343.9 [$\pm 12.0\%$] (726.2)	1.292	<0.00001	++ (++)
LeftInfLatVent	78 (77)	69	85	507.6 [$\pm 51.1\%$] (674.5)	-154.9 [$\pm 12.5\%$] (368.9)	1.258	<0.00001	++ (++)
ITG	72 (72)	70	74	-1914.4 [$\pm 8.1\%$] (2520.3)	714.2 [$\pm 3.0\%$] (1977.7)	1.176	<0.00001	++ (++)
RightInfLatVent	75 (74)	62	86	512.3 [$\pm 45.1\%$] (813.3)	-188.9 [$\pm 13.3\%$] (406.6)	1.130	<0.00001	++ (++)
PHG	70 (69)	67	71	-375.8 [$\pm 5.6\%$] (181.5)	391.3 [$\pm 5.7\%$] (725.6)	0.999	<0.00001	++ (++)
MTG	69 (69)	69	69	-1814.7 [$\pm 6.8\%$] (2906.6)	384.9 [$\pm 2.9\%$] (2492.7)	0.987	<0.00001	++ (++)
AnG	69 (68)	67	70	-1541.3 [$\pm 9.1\%$] (2255.3)	398.2 [$\pm 2.2\%$] (2012.6)	0.913	<0.00001	++ (++)
TPM	67 (67)	66	68	-1304.7 [$\pm 8.8\%$] (2024.3)	286.2 [$\pm 1.9\%$] (1571.3)	0.891	<0.00001	++ (++)
LateralVentricle	71 (70)	62	78	12099.2 [$\pm 4.3\%$] (21157.2)	-3927.7 [$\pm 8.0\%$] (16307.6)	0.861	<0.00001	++ (++)
LeftLateralVentricle	71 (70)	63	77	6554.1 [$\pm 5.0\%$] (11534.0)	-2506.0 [$\pm 4.8\%$] (8897.1)	0.849	<0.00001	++ (++)
RightLateralVentricle	69 (69)	59	78	5744.4 [$\pm 5.0\%$] (9897.3)	-1661.5 [$\pm 7.4\%$] (6937.3)	0.814	<0.00001	++ (++)
STG	65 (65)	65	64	-696.5 [$\pm 5.4\%$] (1586.7)	-406.0 [$\pm 2.9\%$] (1528.8)	0.716	<0.00001	++ (++)
3rdVentricle	66 (66)	64	68	334.0 [$\pm 26.4\%$] (727.5)	-120.7 [$\pm 5.1\%$] (602.4)	0.688	<0.00001	++ (++)
SMG	64 (64)	63	65	-842.5 [$\pm 5.6\%$] (2007.7)	382.4 [$\pm 2.6\%$] (1703.2)	0.664	<0.00001	++ (++)
ThalamusProper	64 (64)	63	65	-374.4 [$\pm 4.7\%$] (1213.4)	326.0 [$\pm 2.5\%$] (1012.3)	0.633	<0.00001	++ (++)
FuG	63 (63)	64	62	-852.2 [$\pm 5.2\%$] (1762.3)	252.3 [$\pm 1.5\%$] (1775.8)	0.624	<0.00001	++ (++)
OfUg	60 (59)	58	61	-465.1 [$\pm 8.0\%$] (1222.5)	46.9 [$\pm 0.5\%$] (1074.6)	0.615	<0.00001	++ (++)
BasalForebrain	63 (63)	65	61	-71.2 [$\pm 8.1\%$] (191.4)	44.4 [$\pm 5.1\%$] (191.4)	0.601	<0.00001	++ (++)
AIn	60 (60)	63	57	-379.8 [$\pm 4.5\%$] (1005.1)	175.5 [$\pm 2.0\%$] (942.9)	0.572	<0.00001	++ (++)
MOG	59 (59)	50	58	-596.0 [$\pm 5.6\%$] (1367.4)	27.7 [$\pm 0.3\%$] (1200.4)	0.488	<0.00001	++ (++)
Accumbens	59 (59)	51	61	-64.1 [$\pm 3.7\%$] (257.5)	27.0 [$\pm 3.7\%$] (256.0)	0.480	<0.00001	++ (++)
PP	57 (59)	61	54	-47.4 [$\pm 1.9\%$] (467.7)	137.7 [$\pm 3.7\%$] (440.2)	0.454	<0.00001	++ (++)
SPL	57 (57)	58	56	-853.9 [$\pm 4.7\%$] (2153.6)	67.5 [$\pm 0.3\%$] (1987.6)	0.447	<0.00001	++ (++)
IOG	59 (59)	59	60	-615.1 [$\pm 4.9\%$] (1610.8)	42.1 [$\pm 0.6\%$] (1408.8)	0.438	<0.00001	++ (++)
PIns	58 (58)	59	58	-162.8 [$\pm 3.6\%$] (525.7)	71.3 [$\pm 1.5\%$] (549.4)	0.434	<0.00001	++ (++)
MFG	58 (58)	56	60	-891.1 [$\pm 2.5\%$] (3695.3)	589.1 [$\pm 1.7\%$] (3195.0)	0.432	<0.00001	++ (++)
McG	58 (58)	55	61	470.6 [$\pm 4.9\%$] (1280.9)	-55.3 [$\pm 0.5\%$] (1198.5)	0.426	<0.00001	++ (++)
FO	59 (59)	59	59	-132.0 [$\pm 3.5\%$] (516.2)	73.8 [$\pm 2.0\%$] (467.7)	0.420	<0.00001	++ (++)
Caudate	59 (58)	47	69	689.0 [$\pm 9.8\%$] (2404.7)	-133.8 [$\pm 1.5\%$] (1618.1)	0.410	<0.00001	++ (++)
SFG	59 (59)	60	58	-933.3 [$\pm 3.5\%$] (3020.4)	214.7 [$\pm 0.7\%$] (2641.4)	0.407	<0.00001	++ (++)
PT	55 (55)	57	53	-53.4 [$\pm 2.2\%$] (581.1)	178.3 [$\pm 3.6\%$] (579.1)	0.359	<0.00001	++ (++)
THG	56 (56)	55	57	-125.4 [$\pm 1.7\%$] (1000.8)	109.9 [$\pm 3.2\%$] (975.8)	0.336	<0.00001	++ (++)
PCu	56 (56)	57	55	-641.8 [$\pm 2.9\%$] (2565.9)	112.6 [$\pm 0.5\%$] (2136.2)	0.323	<0.00002	+ (o)
PCgG	57 (57)	58	56	-284.5 [$\pm 3.3\%$] (1065.4)	0.2 [$\pm 0.1\%$] (909.4)	0.305	0.00005	+ (o)
SCA	58 (58)	57	59	-69.5 [$\pm 2.7\%$] (446.7)	54.8 [$\pm 2.4\%$] (392.1)	0.290	0.00007	+ (o)
Putamen	57 (58)	58	57	-320.8 [$\pm 3.9\%$] (1317.3)	61.1 [$\pm 0.9\%$] (1253.7)	0.290	0.00007	+ (o)
POG	56 (56)	54	58	-112.3 [$\pm 1.8\%$] (731.8)	96.6 [$\pm 1.6\%$] (688.8)	0.295	0.00009	+ (o)
CSF	57 (57)	52	62	225.1 [$\pm 10.6\%$] (581.5)	61.9 [$\pm 2.6\%$] (557.8)	0.287	0.00013	+ (o)
MSFG	54 (54)	56	53	-241.5 [$\pm 1.9\%$] (1436.6)	115.4 [$\pm 1.0\%$] (1344.2)	0.257	0.00006	+ (o)
CerebellumWhiteMatter	55 (54)	46	62	738.8 [$\pm 3.3\%$] (8174.5)	-1056.6 [$\pm 2.9\%$] (7032.0)	0.237	0.00014	+ (o)
OCG	56 (56)	58	54	-253.0 [$\pm 2.0\%$] (1040.0)	-32.0 [$\pm 1.0\%$] (958.8)	0.209	0.00038	+ (o)
CerebralWhiteMatter	55 (55)	52	58	2341.2 [$\pm 6.6\%$] (26562.0)	-3234.1 [$\pm 0.8\%$] (2574.9)	0.214	0.00427	+ (o)
MFC	54 (54)	55	54	-20.1 [$\pm 0.5\%$] (580.2)	132.2 [$\pm 3.8\%$] (502.0)	0.208	0.00544	+ (o)
Calc	54 (54)	54	54	316.3 [$\pm 5.1\%$] (1523.0)	9.4 [$\pm 0.7\%$] (1471.7)	0.205	0.00614	+ (o)
CerebellarVermalLobulesVI-V	55 (55)	57	53	-56.5 [$\pm 1.2\%$] (620.2)	71.9 [$\pm 1.6\%$] (634.4)	0.204	0.00637	+ (o)
OCP	53 (53)	57	49	-292.2 [$\pm 5.9\%$] (818.1)	-102.2 [$\pm 1.8\%$] (1009.3)	0.204	0.00663	+ (o)
CerebellarVermalLobulesVII-VII	55 (54)	52	57	60.7 [$\pm 2.5\%$] (402.7)	-15.9 [$\pm 0.7\%$] (372.9)	0.194	0.00815	+ (o)
OrIFG	55 (55)	59	52	-122.8 [$\pm 4.3\%$] (523.6)	-24.6 [$\pm 0.9\%$] (514.5)	0.189	0.01150	+ (o)
LorG	53 (53)	56	50	-80.7 [$\pm 2.3\%$] (576.7)	21.3 [$\pm 0.4\%$] (510.5)	0.189	0.01179	+ (o)
GRG	53 (53)	55	51	-92.7 [$\pm 2.8\%$] (463.3)	-10.2 [$\pm 0.3\%$] (479.8)	0.175	0.01973	+ (o)
OpIFG	51 (51)	52	48	-133.9 [$\pm 4.0\%$] (1040.0)	10.5 [$\pm 1.7\%$] (1033.2)	0.170	0.02045	+ (o)
SMC	52 (52)	54	50	60.6 [$\pm 0.4\%$] (1314.2)	251.2 [$\pm 2.4\%$] (1107.5)	0.158	0.03459	+ (o)
AoG	52 (52)	52	51	8.6 [$\pm 0.2\%$] (483.6)	71.8 [$\pm 1.8\%$] (469.0)	0.133	0.07602	+ (o)
PO	52 (52)	52	51	-98.1 [$\pm 2.1\%$] (672.1)	-12.4 [$\pm 0.3\%$] (650.8)	0.130	0.08282	+ (o)
MPvG	53 (53)	52	53	19.5 [$\pm 1.2\%$] (377.8)	65.7 [$\pm 3.9\%$] (350.7)	0.127	0.08866	+ (o)
Pallidum	54 (54)	55	54	49.5 [$\pm 2.0\%$] (421.2)	4.7 [$\pm 0.3\%$] (363.8)	0.115	0.12479	+ (o)
TTG	52 (52)	53	52	-20.6 [$\pm 0.6\%$] (473.0)	27.2 [$\pm 1.3\%$] (469.5)	0.102	0.17431	+ (o)
PrG	52 (52)	55	50	-16.0 [$\pm 0.1\%$] (2725.2)	232.1 [$\pm 1.0\%$] (2480.6)	0.098	0.20045	+ (o)
PoG	51 (51)	51	52	-256.6 [$\pm 1.3\%$] (2130.7)	-70.4 [$\pm 0.3\%$] (1916.2)	0.092	0.21647	+ (o)
FRP	50 (50)	54	47	-98.3 [$\pm 1.9\%$] (956.4)	-39.5 [$\pm 0.6\%$] (906.6)	0.063	0.39674	+ (o)
CerebellumExtensor	52 (52)	52	52	974.0 [$\pm 1.0\%$] (1040.0)	441.4 [$\pm 0.4\%$] (905.0)	0.057	0.46205	+ (o)
MPG	49 (49)	50	48	-43.8 [$\pm 0.6\%$] (223.0)	30.1 [$\pm 0.7\%$] (75.0)	0.055	0.52025	+ (o)
LIG	52 (52)	52	51	131.7 [$\pm 0.6\%$] (2042.2)	35.4 [$\pm 0.1\%$] (1860.5)	0.050	0.50734	+ (o)
CO	48 (48)	48	48	18.4 [$\pm 0.6\%$] (793.3)	85.8 [$\pm 1.1\%$] (808.2)	0.047	0.52523	+ (o)
CerebellarVermalLobulesVIII-X	51 (51)	50	51	-4.3 [$\pm 0.2\%$] (423.2)	-22.1 [$\pm 0.8\%$] (376.0)	0.045	0.54714	+ (o)
4thVentricle	51 (50)	46	55	38.6 [$\pm 1.5\%$] (648.7)	17.3 [$\pm 0.5\%$] (649.6)	0.033	0.66059	+ (o)
VentralDC	46 (46)	46	47	109.7 [$\pm 1.4\%$] (706.0)	127.5 [$\pm 1.5\%$] (597.5)	0.027	0.71330	+ (o)
ACg	48 (48)	48	48	28.6 [$\pm 0.2\%$] (1173.1)	58.9 [$\pm 0.6\%$] (1127.3)	0.026	0.72327	+ (o)
BrainStem	49 (49)	48	50	232.2 [$\pm 1.3\%$] (1581.1)	192.3 [$\pm 1.0\%$] (1488.8)</td			