Weakly Supervised Co-saliency Detection via Class Excitation Mapping

Anonymous ACCV 2018 submission

Paper ID 658

Quantitative comparisons of F-measure scores between our method (based on ResNet-50) and state-of-the-art methods based on the Cosal2015 dataset, the MSRC dataset and the iCoseg dataset. Note that the best and the second best results are highlighted with **boldface** and <u>underline</u>, respectively.

	Metric	CBCS-S	CBCS-C	CSHS	SACS	DW	DRFI	OURS
Λ1	F-measure	0.747	0.696	0.714	0.696	0.750	0.837	0.873
Aeroplane	AP-score	0.778	0.745	0.764	0.867	0.842	0.878	0.910
Annla	F-measure	0.718	0.712	0.705	0.712	0.804	0.774	0.870
Apple	AP-score	0.783	0.813	0.709	0.840	0.898	0.864	0.914
Arro	F-measure	0.441	0.383	0.411	0.383	0.448	0.467	0.585
Axe	AP-score	0.398	0.378	0.363	0.513	0.423	0.465	0.597
Babycrib	F-measure	0.436	0.435	0.660	0.435	0.738	0.516	0.761
Бабустъ	AP-score	0.548	0.564	0.712	0.640	0.791	0.635	0.806
Danana	F-measure	0.678	0.741	0.683	0.741	0.791	0.679	0.768
Banana	AP-score	0.702	0.793	0.713	0.723	0.865	0.650	0.805
D l 11	F-measure	0.326	0.374	0.322	0.374	0.513	0.434	0.588
Baseball	AP-score	0.294	0.316	0.264	0.364	0.578	0.411	0.649
Doom	F-measure	0.520	0.542	0.712	0.542	0.779	0.731	0.841
Bear	AP-score	0.529	0.554	0.819	0.721	0.886	0.812	0.863
D:ll: and tab	F-measure	0.564	0.566	0.368	0.566	0.586	0.515	0.731
Billiardtab	AP-score	0.548	0.596	0.339	0.604	0.583	0.515	0.773
D: J	F-measure	0.483	0.433	0.451	0.433	0.577	0.570	0.689
Bird	AP-score	0.493	0.431	0.508	0.653	0.677	0.618	0.842
Doot	F-measure	0.536	0.521	0.597	0.521	0.647	0.662	0.674
Boat	AP-score	0.532	0.523	0.601	0.643	0.676	0.672	0.690
Dowl	F-measure	0.550	0.556	0.534	0.678	0.659	0.628	0.748
Bowl	AP-score	0.636	0.611	0.562	0.745	0.706	0.705	0.788
D 44 0	F-measure	0.697	0.653	0.858	0.773	0.841	0.840	0.865
Butterfly	AP-score	0.699	0.730	0.896	0.759	0.899	0.882	$\overline{0.923}$

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2 ACCV-18 submission ID 658

Camel	F-measure 0.644	0.628	0.746	0.792	0.838	0.790	0.847
	AP-score 0.674	0.712	0.780	0.811	0.885	0.818	0.889
Car	F-measure 0.431	0.447	0.606	0.595	0.683	0.676	0.788
∪a1	AP-score 0.424	0.474	0.685	0.653	0.748	0.780	0.876
Q-+	F-measure 0.373	0.388	0.401	0.516	0.569	0.584	0.694
Cat	AP-score 0.372	0.380	0.393	0.523	0.546	0.554	0.728
?1 1 ₋	F-measure 0.644	0.595	0.655	0.726	0.750	0.710	0.780
Chook	AP-score 0.670	0.705	0.706	0.750	0.803	0.755	0.796
7- G	F-measure 0.614	0.603	0.504	0.656	0.699	0.677	0.755
Coffeecup	AP-score 0.642	0.667	0.501	0.715	0.754	0.730	0.778
<u></u>	F-measure 0.715	0.758	0.751	0.795	0.840	0.801	0.894
Cow	AP-score 0.717	0.741	0.708	0.853	0.880	0.820	0.919
D	F-measure 0.578	0.553	0.676	0.732	0.750	0.765	0.845
Deer	AP-score 0.568	0.540	0.698	0.759	0.831	0.785	0.866
	F-measure 0.653	0.623	0.598	0.703	0.677	0.754	0.820
Dog	AP-score 0.665	0.604	0.613	0.746	0.741	0.852	0.922
	F-measure 0.602	0.576	0.684	0.597	0.704	0.640	0.748
Frenchhorn	AP-score 0.672	0.686	0.736	0.656	$\frac{0.755}{0.755}$	0.702	0.787
	F-measure 0.623	0.587	0.662	0.756	0.739	0.770	0.856
Frog	AP-score 0.632	0.628	0.680	0.818	0.790	0.840	0.906
C 11 6 1	F-measure 0.760	0.725	0.764	0.816	0.813	0.761	0.845
Goldenfish	AP-score 0.795	0.827	0.846	$\overline{0.889}$	0.904	0.801	<u>0.890</u>
a	F-measure 0.605	0.575	0.660	0.669	0.680	0.723	0.698
Guitar	AP-score 0.662	0.691	0.689	0.745	0.769	0.787	0.788
	F-measure 0.255	0.245	0.278	0.294	0.315	0.300	0.416
Hammer	AP-score 0.220	0.211	0.219	0.272	0.298	0.291	0.450
	F-measure 0.580	0.527	0.597	0.686	0.653	0.673	0.770
Helmet	AP-score 0.618	0.612	0.621	0.731	0.696	0.733	0.804
	F-measure 0.573	0.605	0.573	0.698	0.724	0.680	0.770
Horse	AP-score 0.569	0.602	0.561	0.691	$\frac{0.769}{0.769}$	0.651	0.805
	F-measure 0.356	0.445	0.419	0.434	0.411	0.409	0.563
Ladybird	AP-score 0.351	$\frac{0.110}{0.527}$	$\frac{0.741}{0.741}$	0.523	0.700	0.592	0.812
	F-measure 0.663	0.725	0.663	0.710	0.830	0.679	0.855
Lemon	AP-score 0.646	0.776	0.624	0.724	0.909	0.671	0.889
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Lizard	F-measure 0.552	0.462	0.637	0.655	0.582	0.651	0.751

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Mobulidae	F-measure 0.558	0.457	0.631	0.708	0.692	0.679	0.787
Mobulidac	AP-score 0.525	0.485	0.562	0.670	0.648	0.670	0.777
Manlar	F-measure 0.406	0.419	0.543	0.593	0.724	0.634	0.770
Monkey	AP-score 0.411	0.422	0.550	0.612	0.778	0.625	0.789
Motorbike	F-measure 0.471	0.520	0.597	0.617	0.639	0.700	0.799
MOTOLDIKE	AP-score 0.467	0.550	0.601	0.720	0.789	0.819	0.884
Mouse	F-measure 0.514	0.523	0.597	0.575	0.650	0.586	0.689
Mouse	AP-score 0.552	0.558	0.606	0.616	0.707	0.615	0.709
Mushroom	F-measure 0.643	0.661	0.654	0.757	0.704	0.769	0.825
Musimooni	AP-score 0.659	0.667	0.663	0.769	0.756	0.794	0.848
Penguin	F-measure 0.585	0.551	0.669	0.671	0.712	<u>0.730</u>	0.772
ı engum	AP-score 0.641	0.637	0.700	0.728	0.770	0.808	0.817
Pepper	F-measure 0.750	0.729	0.656	0.836	0.818	0.811	0.874
r ebber	AP-score 0.817	0.839	0.753	<u>0.901</u>	0.892	0.863	0.912
Piano	F-measure 0.397	0.324	0.535	0.422	0.516	0.456	0.542
1 14110	AP-score 0.629	0.618	0.719	0.635	0.702	0.666	0.765
Pig	F-measure 0.714	0.670	0.650	0.785	0.788	0.815	0.859
rīR	AP-score 0.747	0.729	0.639	0.841	0.823	0.862	0.903
Pineapple	F-measure 0.460	0.424	0.471	0.566	0.721	0.658	0.808
i meappie	AP-score 0.499	0.504	0.526	0.590	<u>0.768</u>	0.655	0.846
Rabbit	F-measure 0.439	0.450	0.546	0.578	0.647	0.618	0.727
	AP-score 0.436	0.441	0.492	0.555	0.671	0.616	0.721
Sealion	F-measure 0.486	0.492	0.585	0.612	0.645	0.676	0.733
	AP-score 0.467	0.491	0.561	0.623	<u>0.694</u>	0.675	0.798
Snail	F-measure 0.506	0.516	0.660	0.676	0.737	0.709	0.825
	AP-score 0.506	0.508	0.711	0.725	0.819	0.762	0.875
Snake	F-measure 0.697	0.706	0.756	0.758	0.739	0.692	0.813
JIIake	AP-score 0.693	0.752	0.756	0.791	0.772	0.725	0.843
Sofa	F-measure 0.409	0.398	0.459	0.549	0.540	0.528	0.701
	AP-score 0.442	0.431	0.437	0.561	0.565	0.545	0.730
Ctanfiala	F-measure 0.819	0.795	0.760	0.879	0.786	0.873	0.903
Starfish	AP-score 0.833	0.825	0.735	0.911	0.837	0.906	0.931
		0.400	0.663	0.618	0.751	0.627	0.780
	F-measure 0.462	0.488	0.005	0.010		0.0-1	00
Tiger	F-measure 0.462 AP-score 0.498	0.488 0.540	0.678	0.661	0.785	0.663	0.808
Tiger Train							

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4 ACCV-18 submission ID 658

	E		9 0.47	0 0	eto.	0.714	0.776	0.740	0.02
Turtle	AP-sc	sure 0.55 ore 0.62				0.714 0.736	$\frac{0.776}{0.829}$	$0.749 \\ 0.788$	0.83 0.87
Viola	F-mea AP-sc	sure 0.67 ore 0.70				0.742 0.789	$0.825 \\ 0.932$	0.700 0.700	$\frac{0.800}{0.848}$
Overall	F-mea	sure 0.57 ore 0.58				0.564 0.691	$\frac{0.705}{0.706}$	0.681 0.703	0.78
	Metric	CBCS-S	CBCS-C	CSHS	SACS	DW	DRFI	SP-MIL	OURS
Cattle	F-measure AP-score	0.834 0.868	$0.795 \\ 0.874$		0.867 0.911				0.920 0.925
Tree	F-measure AP-score		0.479 0.751		0.712 0.877				0.868 <u>0.926</u>
House	F-measure AP-score	0.568 0.681	0.527 0.690		0.737 0.879				$0.884 \\ 0.933$
Airplan	F-measure AP-score	0.525 0.549	0.472 0.526		0.673 0.685				$0.782 \\ 0.838$
Face	F-measure AP-score		0.576 0.599		0.767 0.735		0.800 0.819		0.844 0.863
Bike	F-measure AP-score	0.493 0.614	0.463 0.643		0.613 0.719				0.691 0.701
Car	F-measure AP-score		0.589 0.787		0.726 0.900				0.891 0.934
Overall	F-measure AP-score	0.619 0.692	0.594 0.709		0.754 0.826				0.850 0.879
	Metric	CBCS-S	CBCS-C	CSHS	SACS	5 DW	DRFI	SP-MIL	OUR
1	F-measure AP-score	0.538 0.541	0.504 0.543	0.695 0.688	0.716 0.748		0.785 0.808	0.792 0.852	0.889
٠,	F-measure AP-score	0.792 0.831	0.832 0.870	$\frac{0.861}{0.912}$	0.838 0.92 5	0.857 5 0.900	0.863 <u>0.922</u>	3 0.852 0.919	0.843 0.910
	F-measure		0.270		0.810		0.654 0.940	0.810 0.929	$\frac{0.864}{0.895}$
3	AP-score	0.583	0.364	0.954	0.921	0.940	0.040	0.020	

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180 180 $0.666 \quad 0.631$ F-measure 0.620 0.662 $0.689 \quad 0.664$ 0.7280.714181 181 5 0.6310.697 **0.877** 0.733 0.7870.595AP-score 0.870 0.776182 182 183 183 F-measure 0.811 0.810 0.856 $0.860 \quad 0.770$ 0.8550.881 0.7776 184 184 AP-score 0.8520.8830.9090.930**0.954** 0.821 0.9490.949185 185 F-measure 0.737 0.870 $0.866 \quad 0.772$ 0.8060.6290.7420.849186 186 AP-score 0.8570.894 **0.941** 0.886 0.9270.6970.8950.910 187 187 188 188 F-measure 0.340 0.326 $0.634 \quad 0.473$ 0.7540.5770.702 0.831 8 189 189 0.903 0.3960.858AP-score 0.3730.6310.4100.5590.707190 190 F-measure 0.307 0.3420.418 0.499 **0.806** 0.641 0.5900.706191 191 9 AP-score 0.4110.358 $0.422 \quad 0.439$ **0.809** 0.524 0.5130.734192 192 193 193 0.916 F-measure 0.493 0.532 $0.627 \quad 0.782$ 0.6730.8750.837 10 194 194 0.944AP-score 0.5180.569 $0.751 \quad 0.862$ $0.712 \quad 0.890$ 0.921195 195 F-measure 0.796 $0.767 \quad 0.776$ 0.7850.936 0.7390.8030.759196 196 11 $0.912 \quad 0.899$ 0.929AP-score 0.9250.9380.8820.9700.804197 197 198 198 F-measure 0.733 0.709 0.7350.819 0.7490.849 0.819 0.73112 199 199 0.8920.8280.8670.8950.8490.9530.9120.978AP-score 200 0.891 $0.838 \quad 0.893$ 0.8950.882F-measure 0.868 0.8670.896201 201 13 **0.965** 0.942 AP-score 0.9260.9100.9030.9610.9310.934202 202 203 203 F-measure 0.554 0.723 $0.486 \quad 0.508$ 0.5950.716 0.5630.57914 204 204 AP-score 0.7340.7960.8150.6900.6790.7760.6870.869205 205 $0.420 \quad 0.468$ 0.581F-measure 0.625 0.7390.5680.4740.696206 206 15 AP-score 0.903 0.9420.8850.8360.8610.9370.7780.938207 207 208 208 0.797F-measure 0.648 0.6140.7110.7840.8430.868 0.85916 209 209 AP-score 0.7180.760 $0.774 \quad 0.850$ 0.9490.9130.9660.911 210 210 0.7250.763F-measure 0.730 0.6790.6910.7400.6940.756211 211 17 AP-score 0.8690.887 $0.860 \quad 0.900$ 0.9200.8950.9550.895212 212 213 213 F-measure 0.925 0.933 0.8390.9220.9240.8710.9270.913 18 214 214 AP-score 0.9860.9770.953 **0.987** 0.951 0.9600.9570.961215 215 0.713F-measure 0.720 0.681 $0.750 \quad 0.707$ 0.7820.742 0.838216 216 19 AP-score 0.8320.8560.8910.8690.885**0.937** 0.928 0.895217 217 218 218 F-measure 0.747 0.7330.811 0.7480.8610.8870.8510.93420 219 219 0.828 0.892 $0.932 \quad 0.927$ **0.981** 0.958 0.944AP-score 0.973220 0.896 $0.763 \quad 0.833$ 0.7700.774F-measure 0.777 0.8320.834221 221 21 AP-score 0.8620.9440.9380.9670.9670.9550.9010.968222 222 223 223 F-measure 0.803 0.8450.9010.9450.9460.9490.9610.86922 224 224 0.966AP-score 0.8640.897 0.960**0.985** 0.968 0.9800.979

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6 ACCV-18 submission ID 658

269

23	F-measure AP-score	$0.775 \\ 0.820$	$0.771 \\ 0.825$	$0.736 \\ 0.905$	$\frac{0.891}{0.945}$	$0.869 \\ 0.922$	$0.820 \\ 0.929$	$0.913 \\ 0.952$	0.788 0.878
24	F-measure AP-score	0.843 0.901	0.820 0.897	0.918 0.958	0.918 0.973	0.939 0.961	0.937 0.972	0.952 0.968	$\frac{0.943}{0.957}$
25	F-measure AP-score	0.805 0.875	0.724 0.923	$\frac{0.833}{0.961}$	0.770 0.921	0.741 0.866	0.806 0.861	0.795 0.962	0.83 0.864
26	F-measure AP-score	0.866 0.948	$0.946 \\ 0.982$	$0.740 \\ 0.964$	$\frac{0.945}{0.981}$	0.764 0.943	0.915 0.981	0.946 0.956	0.913 0.966
27	F-measure AP-score	0.737 0.833	0.788 0.849	0.778 0.910	0.785 0.871	0.788 0.842	0.751 0.791	0.879 0.936	$\frac{0.789}{0.823}$
28	F-measure AP-score	0.596 0.491	0.543 0.461	0.618 0.489	$0.592 \\ 0.455$	$0.\underline{654} \\ 0.748$	0.652 0.661	0.618 0.451	0.70 0.81
29	F-measure AP-score	0.841 0.885	0.846 0.946	$0.830 \\ 0.930$	0.862 0.945	$\frac{0.885}{0.968}$	0.798 0.861	0.890 0.978	0.871
30	F-measure AP-score	0.684 0.729	0.846 0.946	0.709 0.935	0.820 0.950	$\frac{0.908}{0.977}$	0.818 0.976	0.840 0.938	0.93 0.98
31	F-measure AP-score	0.901 0.956	0.831 0.976	0.905 0.979	0.920 0.988	0.882 0.983	0.878 0.975	0.938 0.988	0.856
32	F-measure AP-score	0.812 0.875	0.725 0.826	0.866 0.953	0.829 0.875	0.824 0.894	$\frac{0.868}{0.936}$	0.834 0.877	0.89 0.927
33	F-measure AP-score	0.397 0.446	0.467 0.488	0.437 0.739	0.556 0.790	0.538 0.841	$\frac{0.627}{0.868}$	0.454 0.718	$0.67 \\ 0.88$
34	F-measure AP-score	0.492 0.554	0.460 0.528	0.655 0.717	0.596 0.692	0.620 0.678	$\frac{0.728}{0.784}$	0.583 0.672	$0.77 \\ 0.82$
35	F-measure AP-score	0.488 0.555	0.460 0.506	0.609 0.670	0.593 0.563	0.527 0.577	$\frac{0.640}{0.671}$	0.498 0.539	$0.64 \\ 0.72$
36	F-measure AP-score	0.946 0.973	0.944 <u>0.979</u>	0.948 0.959	0.955 0.984	$\frac{0.955}{0.971}$	0.925 0.959	0.963 0.975	0.949 0.963
37	F-measure AP-score	0.849 0.949	0.829 0.975	0.922 0.960	0.908 <u>0.976</u>	0.804 0.896	0.910 0.971	0.968 0.983	$\frac{0.925}{0.969}$
	F-measure	0.473 0.609	0.556 0.655	0.751 0.862	0.702 0.764	0.685 0.803	0.721 0.899	$\frac{0.758}{0.880}$	$0.85 \\ 0.91$
38	AP-score	0.003	0.000						

269