

Supplementary Material for

On the Evaluation of Unsupervised Outlier Detection: Measures, Datasets, and an Empirical Study

by G. O. Campos, A. Zimek, J. Sander, R. J. G. B. Campello, B. Micenková, E. Schubert, I. Assent and M. E. Houle

Data Mining and Knowledge Discovery 30(4): 891-927, 2016, DOI: 10.1007/s10618-015-0444-8

Wilt (2% of outliers version#01)

The data set differentiates diseased trees from other land covers. The former are considered outliers here.

[Download all data set variants used \(7.2 MB\)](#). You can also access the [original data](#). (merge train and test [wilt.zip])

- [Normalized, without duplicates](#)
- [Normalized, duplicates](#)
- [Not normalized, without duplicates](#)
- [Not normalized, duplicates](#)

Normalized, without duplicates

This version contains 5 attributes, 4655 objects, 93 outliers (2.00%)

[Download raw algorithm results \(39.6 MB\)](#) [Download raw algorithm evaluation table \(72.8 kB\)](#)

Best Parameters

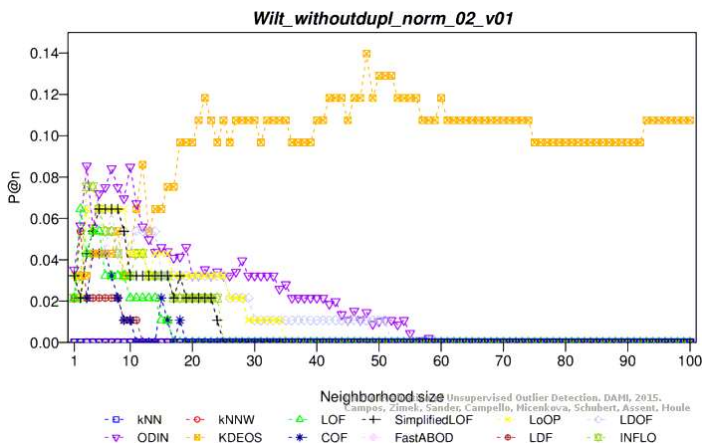
The following table contains the best (overall and per-method) results for each method and evaluation measure (when the same score was achieved twice, only the smallest k is given). The Maximum F1-Measure is complimentary in addition to the measures in the original publication.

Algorithm	k	P@n	Adj. P@n	AP	Adj. AP	Max-F1	Adj. MF1	ROC AUC
KNN	1	0.00000	-0.02039	0.02143	0.00148	0.05388	0.03459	0.57200
KNNW	1	0.00000	-0.02039	0.02370	0.00380	0.05905	0.03987	0.60616
LOF	2	0.06452	0.04545	0.03214	0.01241	0.08358	0.06490	0.61279
LOF	4	0.05376	0.03447	0.03324	0.01353	0.07519	0.05633	0.63268
LOF	6	0.03226	0.01253	0.03292	0.01321	0.07154	0.05261	0.64678
SimplifiedLOF	5	0.06452	0.04545	0.04254	0.02302	0.09904	0.08067	0.70878
SimplifiedLOF	6	0.06452	0.04545	0.04326	0.02376	0.09249	0.07399	0.72371
SimplifiedLOF	10	0.03226	0.01253	0.04078	0.02123	0.09054	0.07200	0.73261

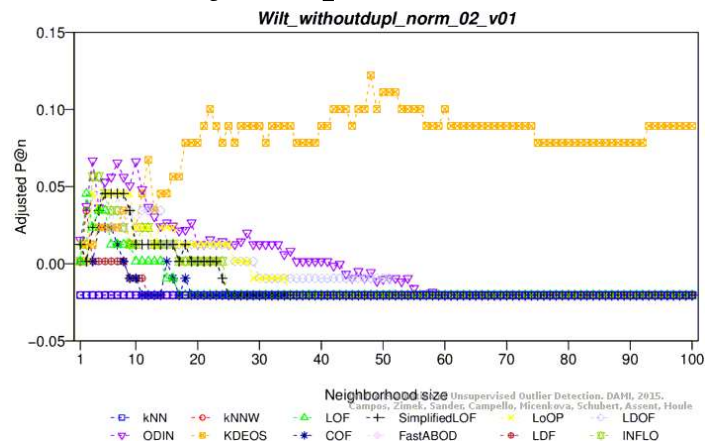
LoOP	3	0.06452	0.04545	0.03924	0.01965	0.08869	0.07011	0.68138
LoOP	5	0.06452	0.04545	0.04386	0.02437	0.10676	0.08855	0.71415
LoOP	6	0.06452	0.04545	0.04520	0.02573	0.09774	0.07935	0.72842
LoOP	10	0.04301	0.02350	0.04275	0.02324	0.09208	0.07357	0.73604
LDOF	3	0.06452	0.04545	0.03966	0.02008	0.08675	0.06813	0.66834
LDOF	5	0.06452	0.04545	0.04507	0.02561	0.11144	0.09332	0.71133
LDOF	7	0.06452	0.04545	0.04985	0.03048	0.11080	0.09268	0.74953
LDOF	10	0.04301	0.02350	0.04753	0.02811	0.09650	0.07808	0.77135
ODIN	3	0.08547	0.06683	0.04559	0.02613	0.12232	0.10443	0.69783
ODIN	7	0.08418	0.06551	0.05445	0.03518	0.11740	0.09940	0.73894
ODIN	9	0.06961	0.05064	0.05130	0.03196	0.12000	0.10206	0.74326
ODIN	10	0.08495	0.06629	0.05259	0.03328	0.12349	0.10562	0.73885
FastABOD	3	0.00000	-0.02039	0.02387	0.00397	0.05610	0.03686	0.59685
FastABOD	4	0.00000	-0.02039	0.02374	0.00384	0.05747	0.03826	0.60446
FastABOD	6	0.00000	-0.02039	0.02334	0.00343	0.05967	0.04051	0.60393
KDEOS	21	0.10753	0.08933	0.06463	0.04557	0.13364	0.11598	0.78982
KDEOS	29	0.10753	0.08933	0.07742	0.05861	0.15122	0.13392	0.78500
KDEOS	41	0.10753	0.08933	0.07623	0.05740	0.15385	0.13660	0.77253
KDEOS	48	0.13978	0.12225	0.07523	0.05638	0.14925	0.13191	0.76650
LDF	2	0.05376	0.03447	0.02981	0.01003	0.06776	0.04875	0.60000
LDF	4	0.02151	0.00156	0.03056	0.01080	0.06282	0.04371	0.62864
LDF	5	0.02151	0.00156	0.02957	0.00979	0.07088	0.05194	0.63006
INFLO	3	0.07527	0.05642	0.03582	0.01616	0.08964	0.07108	0.61762
INFLO	4	0.07527	0.05642	0.03756	0.01794	0.09009	0.07154	0.65191
INFLO	6	0.05376	0.03447	0.03631	0.01666	0.09624	0.07782	0.65300
COF	4	0.04301	0.02350	0.03748	0.01786	0.08565	0.06701	0.67426
COF	6	0.04301	0.02350	0.03551	0.01584	0.07306	0.05416	0.68326

Plots

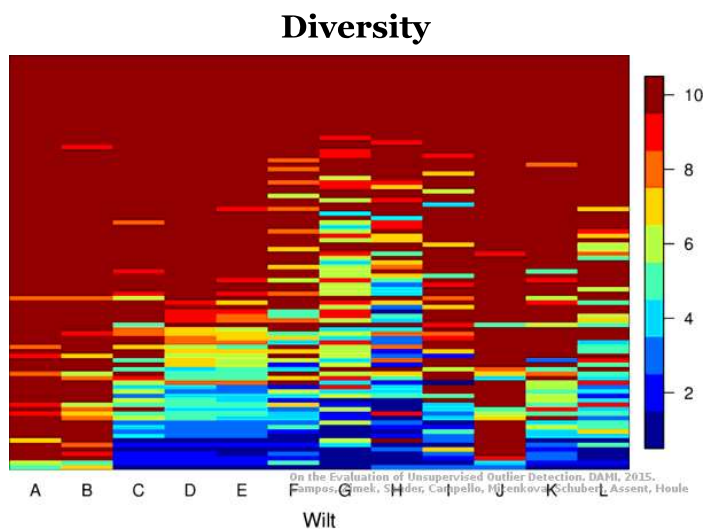
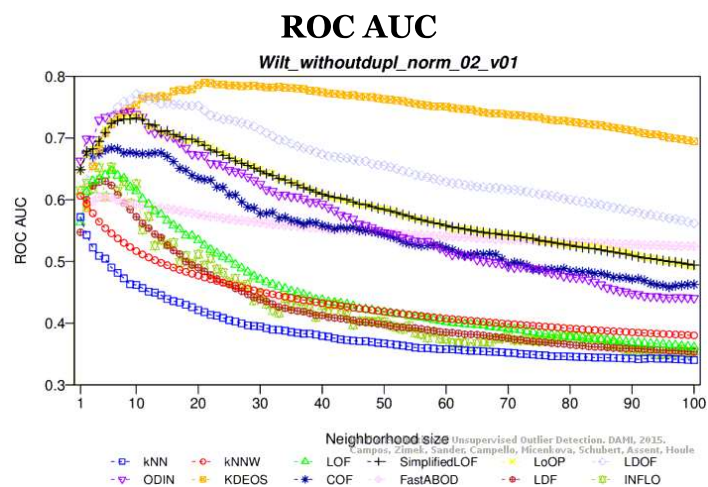
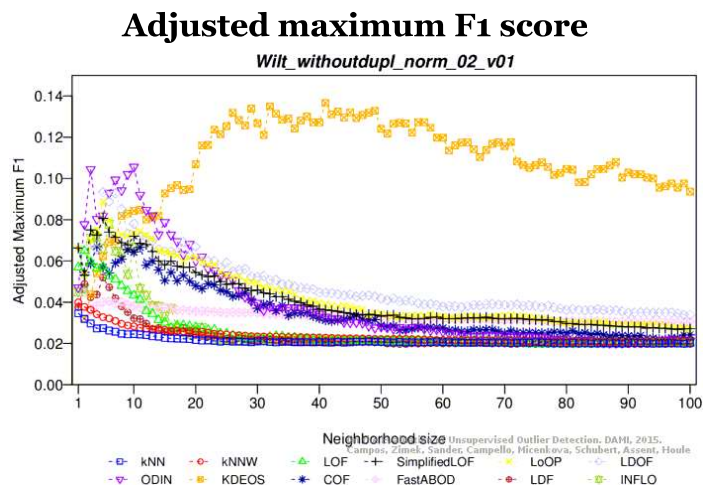
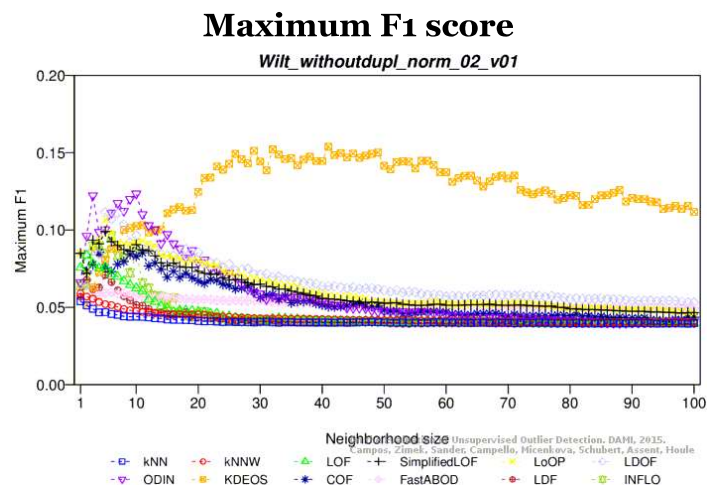
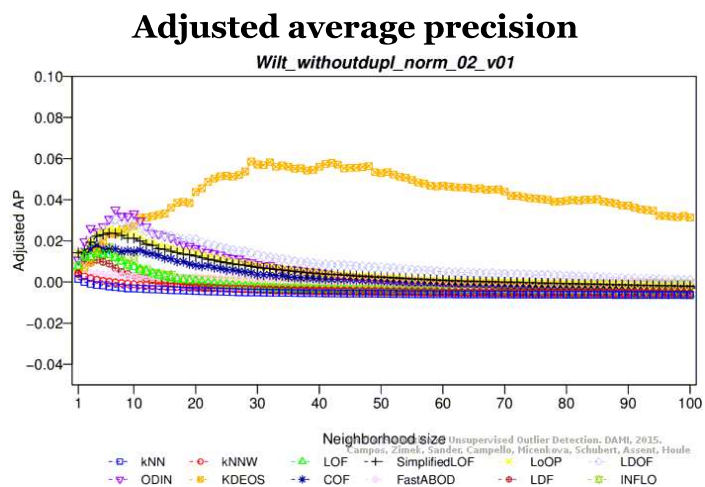
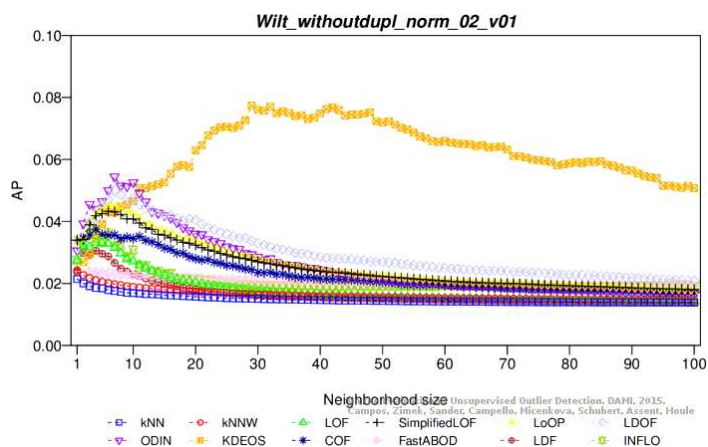
Precision at n



Adjusted precision at n



Average precision



Normalized, duplicates

This version contains 5 attributes, 4671 objects, 93 outliers (1.99%)

[Download raw algorithm results \(39.7 MB\)](#) [Download raw algorithm evaluation table \(72.7 kB\)](#)

Best Parameters

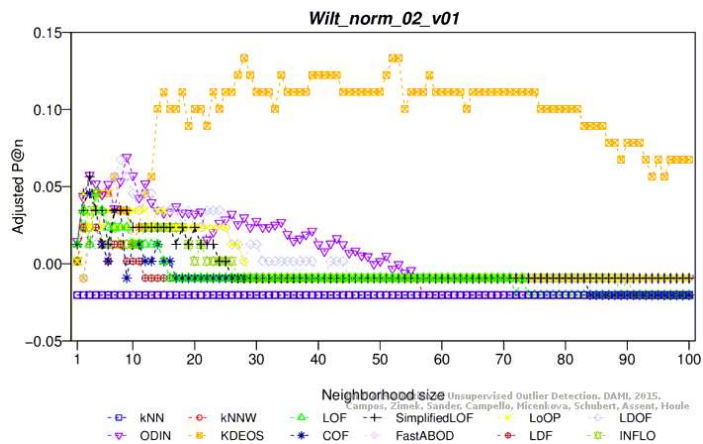
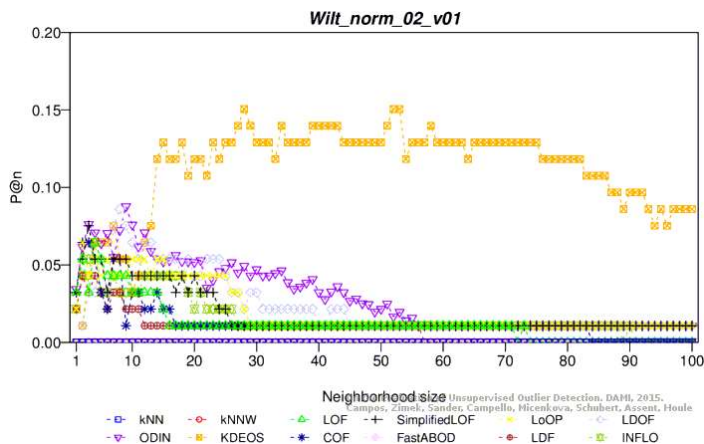
The following table contains the best (overall and per-method) results for each method and evaluation measure (when the same score was achieved twice, only the smallest k is given).
The Maximum F1-Measure is complimentary in addition to the measures in the original publication.

Algorithm	k	P@n	Adj. P@n	AP	Adj. AP	Max-F1	Adj. MF1	ROC AUC
KNN	1	0.00000	-0.02031	0.02415	0.00433	0.05942	0.04031	0.61656
KNNW	1	0.00000	-0.02031	0.02324	0.00340	0.05571	0.03652	0.58472
KNNW	2	0.00000	-0.02031	0.02354	0.00370	0.05613	0.03695	0.60181
KNNW	3	0.00000	-0.02031	0.02322	0.00338	0.05743	0.03828	0.59979
LOF	3	0.03226	0.01260	0.04579	0.02640	0.10969	0.09161	0.71702
LOF	4	0.06452	0.04551	0.04742	0.02806	0.10966	0.09157	0.73600
SimplifiedLOF	3	0.07527	0.05648	0.04551	0.02612	0.11030	0.09223	0.69359
SimplifiedLOF	6	0.03226	0.01260	0.05459	0.03538	0.13258	0.11496	0.76661
SimplifiedLOF	10	0.04301	0.02357	0.05186	0.03260	0.11765	0.09972	0.77844
LoOP	2	0.06452	0.04551	0.03791	0.01836	0.08148	0.06282	0.67843
LoOP	7	0.04301	0.02357	0.05795	0.03881	0.13529	0.11773	0.78119
LoOP	9	0.04301	0.02357	0.05602	0.03684	0.12844	0.11074	0.78654
LDOF	8	0.08602	0.06745	0.05376	0.03454	0.11908	0.10119	0.76894
LDOF	10	0.06452	0.04551	0.05706	0.03791	0.12456	0.10677	0.79553
ODIN	7	0.05497	0.03577	0.07152	0.05265	0.16271	0.14570	0.80665
ODIN	9	0.08774	0.06921	0.06200	0.04294	0.13972	0.12224	0.78186
FastABOD	3	0.00000	-0.02031	0.02583	0.00604	0.06230	0.04325	0.62040
FastABOD	5	0.00000	-0.02031	0.02586	0.00607	0.06400	0.04499	0.63177
KDEOS	21	0.11828	0.10037	0.08956	0.07107	0.16928	0.15240	0.81937
KDEOS	25	0.12903	0.11134	0.08817	0.06964	0.18132	0.16469	0.81454
KDEOS	28	0.15054	0.13328	0.08867	0.07015	0.16156	0.14453	0.81659
LDF	2	0.04301	0.02357	0.03747	0.01791	0.08789	0.06936	0.65949
LDF	4	0.04301	0.02357	0.04102	0.02154	0.09331	0.07489	0.70563
INFLO	4	0.06452	0.04551	0.04387	0.02445	0.10033	0.08206	0.70464
INFLO	6	0.03226	0.01260	0.04674	0.02737	0.12018	0.10231	0.73275
INFLO	8	0.03226	0.01260	0.04410	0.02468	0.12262	0.10479	0.71727
COF	2	0.06452	0.04551	0.03911	0.01959	0.08046	0.06178	0.64393
COF	3	0.06452	0.04551	0.04241	0.02295	0.10612	0.08796	0.65906
COF	4	0.05376	0.03454	0.04364	0.02421	0.10256	0.08433	0.69456
COF	6	0.02151	0.00163	0.04167	0.02220	0.09238	0.07394	0.72088

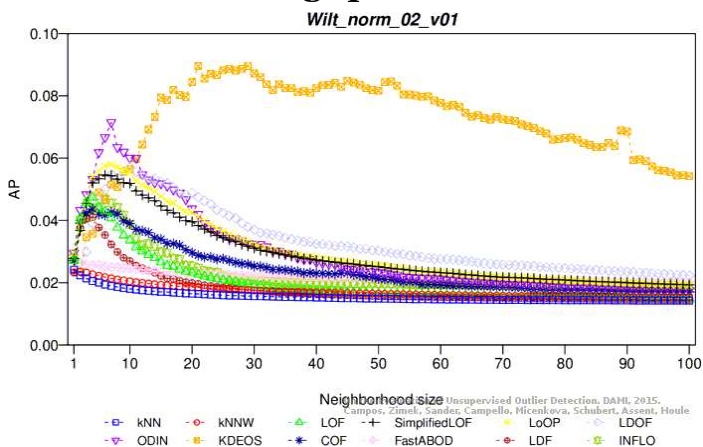
Plots

Precision at n

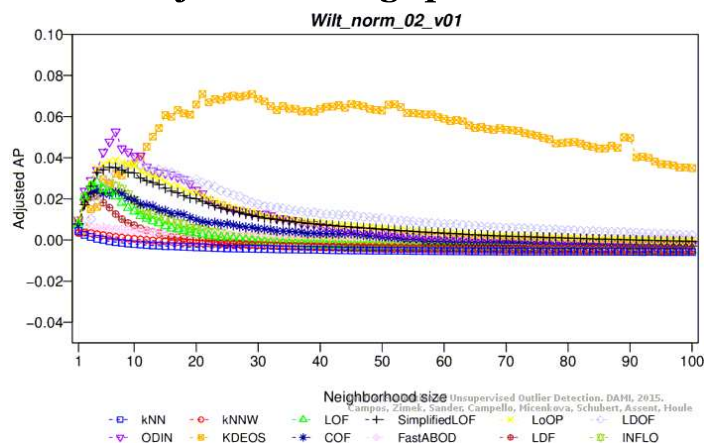
Adjusted precision at n



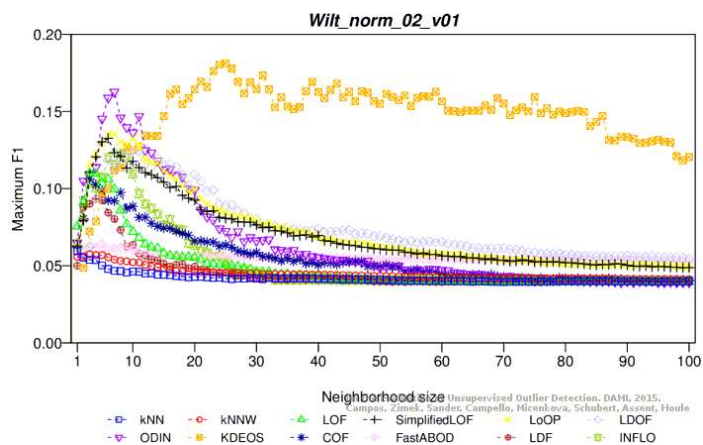
Average precision



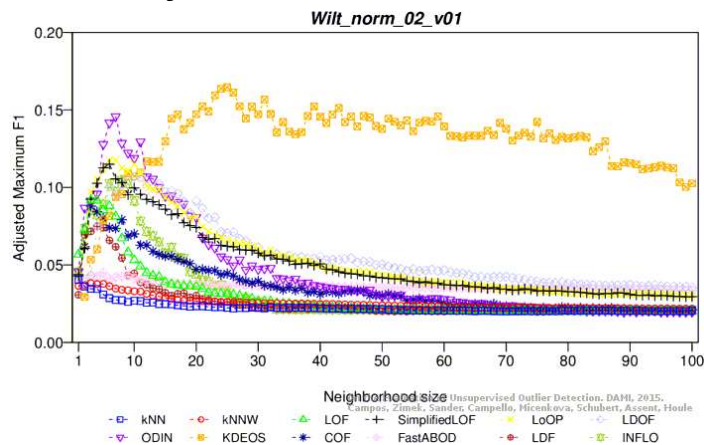
Adjusted average precision



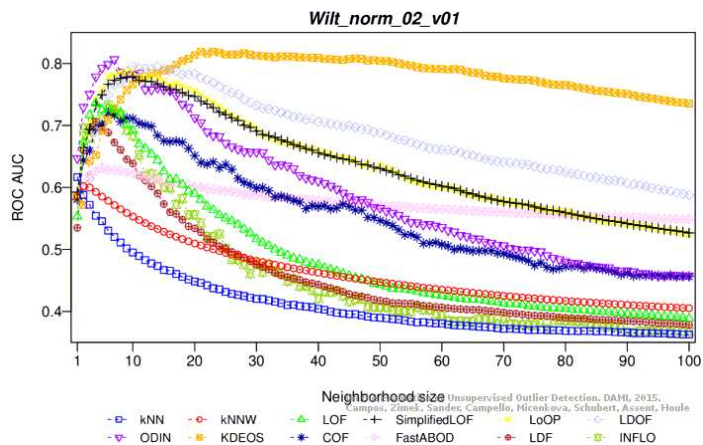
Maximum F1 score



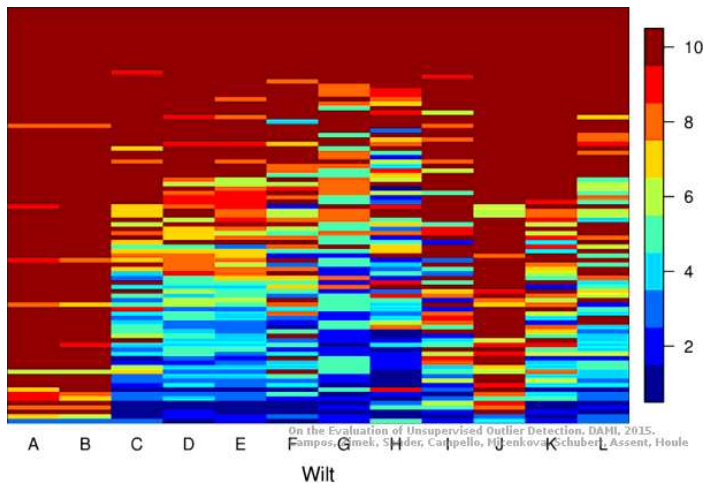
Adjusted maximum F1 score



ROC AUC



Diversity



Not normalized, without duplicates

This version contains 5 attributes, 4655 objects, 93 outliers (2.00%)

[Download raw algorithm results \(40.1 MB\)](#) [Download raw algorithm evaluation table \(72.8 kB\)](#)

Best Parameters

The following table contains the best (overall and per-method) results for each method and evaluation measure (when the same score was achieved twice, only the smallest k is given).
 The Maximum F1-Measure is complimentary in addition to the measures in the original publication.

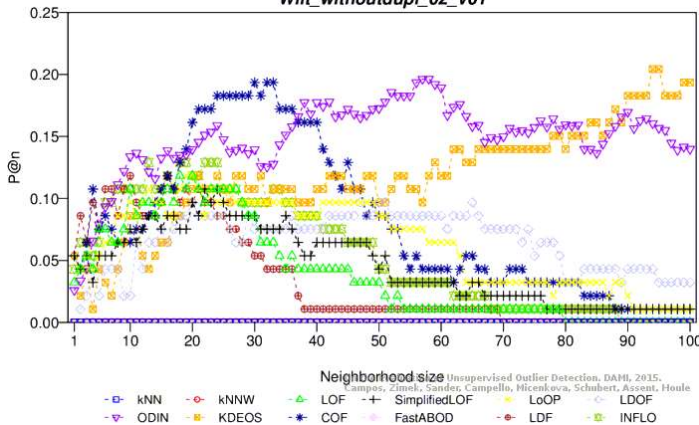
Algorithm	k	P@n	Adj. P@n	AP	Adj. AP	Max-F1	Adj. MF1	ROC AUC
KNN	1	0.00000	-0.02039	0.04000	0.02043	0.09777	0.07937	0.77001
KNN	2	0.00000	-0.02039	0.04165	0.02211	0.10045	0.08211	0.78046
KNN	3	0.00000	-0.02039	0.04100	0.02145	0.10119	0.08287	0.77802
KNNW	1	0.00000	-0.02039	0.03582	0.01616	0.08949	0.07093	0.72632
KNNW	6	0.00000	-0.02039	0.04081	0.02126	0.09770	0.07930	0.77805
KNNW	9	0.00000	-0.02039	0.04020	0.02063	0.09985	0.08150	0.77439
LOF	11	0.08602	0.06739	0.09721	0.07880	0.19900	0.18268	0.88671
LOF	18	0.11828	0.10030	0.10165	0.08333	0.19407	0.17764	0.88236
LOF	19	0.10753	0.08933	0.10176	0.08345	0.20112	0.18483	0.88008
SimplifiedLOF	22	0.10753	0.08933	0.09416	0.07569	0.17996	0.16324	0.88759
SimplifiedLOF	23	0.09677	0.07836	0.09575	0.07731	0.17568	0.15887	0.88967
SimplifiedLOF	27	0.08602	0.06739	0.09566	0.07722	0.17905	0.16231	0.88998
SimplifiedLOF	32	0.07527	0.05642	0.09493	0.07648	0.18232	0.16565	0.88770
LoOP	19	0.11828	0.10030	0.08804	0.06945	0.16460	0.14757	0.87555
LoOP	26	0.10753	0.08933	0.09368	0.07520	0.18075	0.16405	0.88497
LoOP	27	0.09677	0.07836	0.09443	0.07597	0.17851	0.16176	0.88576
LoOP	32	0.09677	0.07836	0.09460	0.07614	0.17935	0.16262	0.88427

LDOF	20	0.09677	0.07836	0.06420	0.04512	0.13559	0.11797	0.81838
LDOF	46	0.08602	0.06739	0.08661	0.06799	0.17009	0.15317	0.88290
LDOF	50	0.09677	0.07836	0.08718	0.06857	0.17722	0.16044	0.88163
LDOF	54	0.08602	0.06739	0.08749	0.06889	0.17208	0.15520	0.88149
ODIN	26	0.13733	0.11974	0.12038	0.10244	0.19377	0.17734	0.89732
ODIN	38	0.17742	0.16065	0.13304	0.11536	0.22152	0.20565	0.89072
ODIN	58	0.19635	0.17997	0.11801	0.10003	0.21466	0.19865	0.86065
ODIN	66	0.15914	0.14200	0.11307	0.09499	0.22663	0.21086	0.84922
FastABOD	3	0.00000	-0.02039	0.02843	0.00863	0.06495	0.04588	0.65416
FastABOD	11	0.00000	-0.02039	0.02934	0.00955	0.06891	0.04993	0.66617
FastABOD	13	0.00000	-0.02039	0.02927	0.00948	0.06655	0.04752	0.66626
KDEOS	93	0.18280	0.16614	0.13454	0.11690	0.20690	0.19073	0.87887
KDEOS	94	0.20430	0.18808	0.13385	0.11619	0.21000	0.19390	0.87901
KDEOS	100	0.19355	0.17711	0.13449	0.11685	0.21333	0.19730	0.87738
LDF	10	0.11828	0.10030	0.10462	0.08636	0.19578	0.17938	0.88910
LDF	20	0.09677	0.07836	0.09408	0.07561	0.20501	0.18880	0.85924
INFLO	13	0.12903	0.11128	0.07190	0.05298	0.13901	0.12146	0.81958
INFLO	24	0.12903	0.11128	0.08227	0.06356	0.16174	0.14465	0.84737
INFLO	27	0.10753	0.08933	0.08440	0.06573	0.16619	0.14919	0.84654
INFLO	30	0.09677	0.07836	0.08181	0.06310	0.16667	0.14968	0.84581
COF	21	0.17204	0.15516	0.11654	0.09853	0.22140	0.20553	0.89495
COF	26	0.18280	0.16614	0.12324	0.10537	0.25296	0.23774	0.88448
COF	30	0.19355	0.17711	0.12006	0.10212	0.23963	0.22413	0.87052

Plots

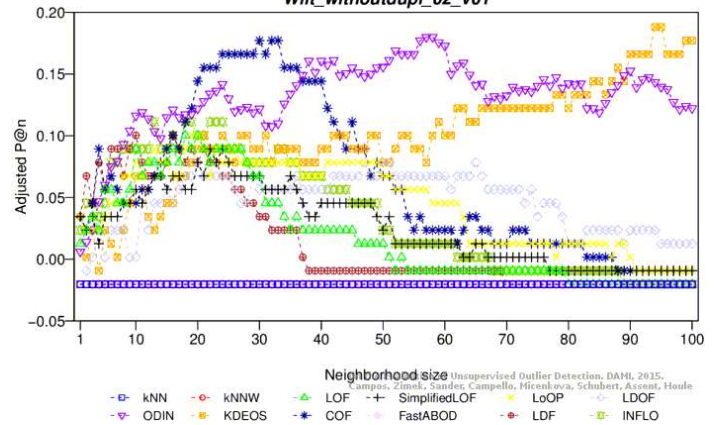
Precision at n

Wilt_withoutdupl_02_v01

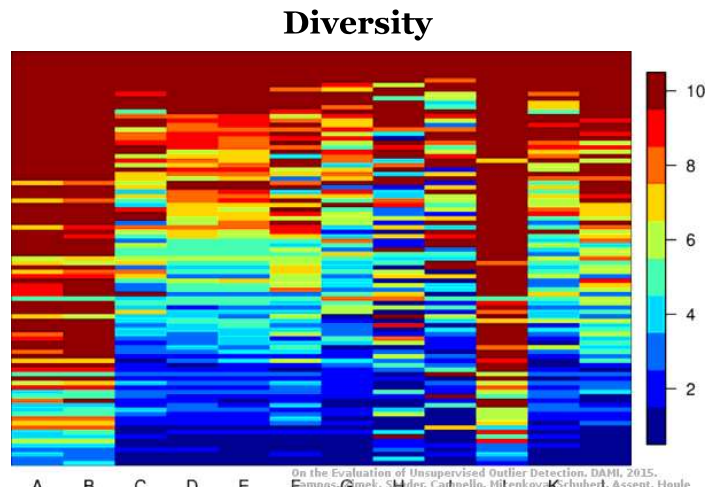
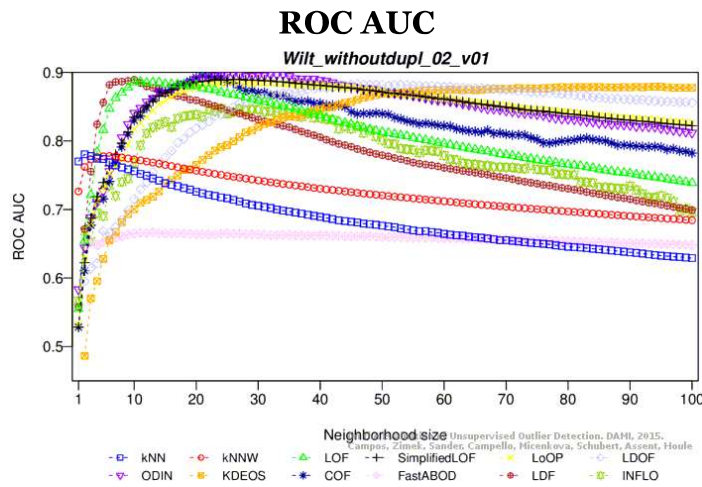
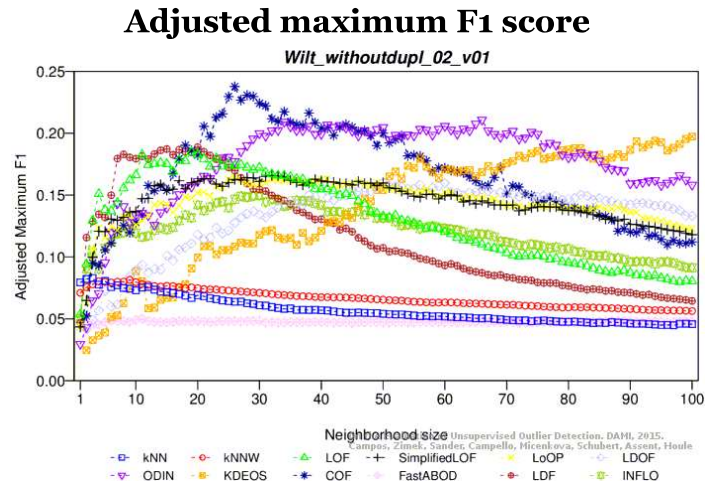
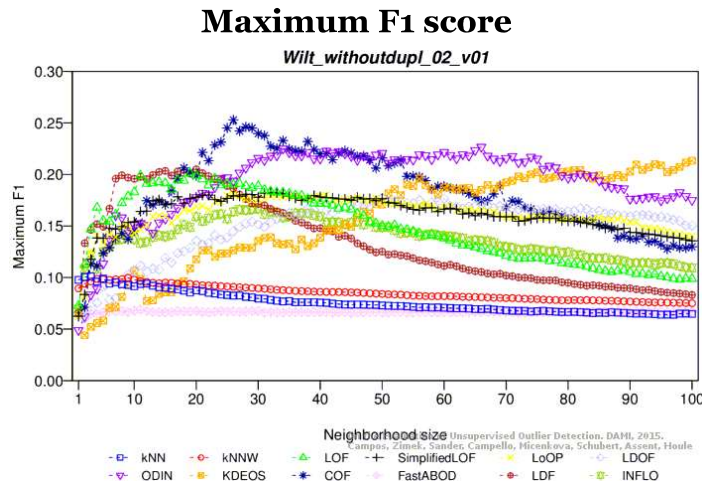
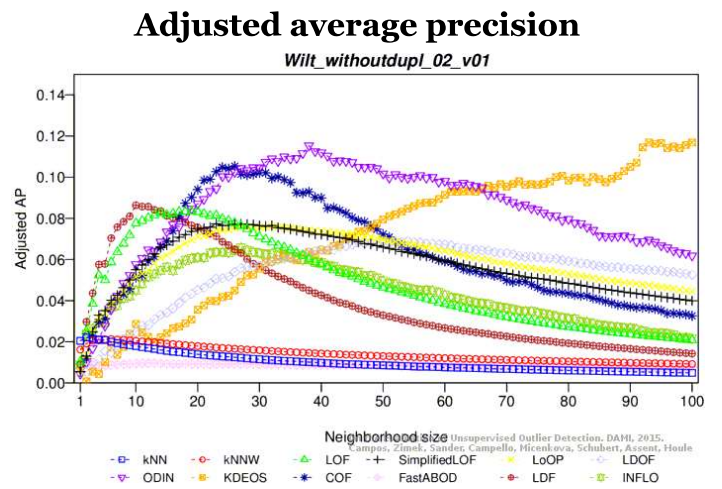
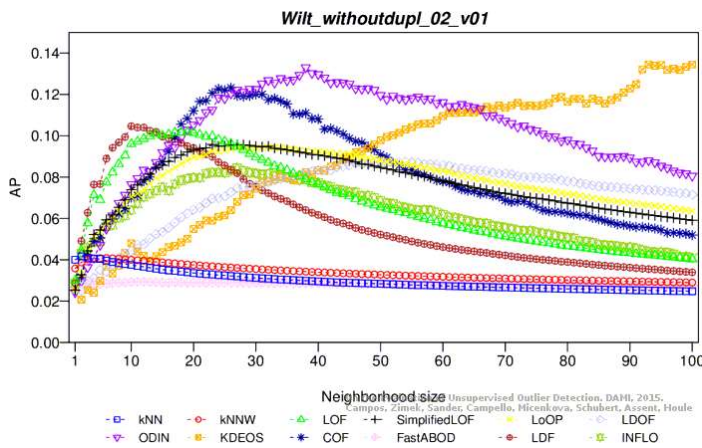


Adjusted precision at n

Wilt_withoutdupl_02_v01



Average precision



Not normalized, duplicates

This version contains 5 attributes, 4671 objects, 93 outliers (1.99%)

[Download raw algorithm results \(40.2 MB\)](#) [Download raw algorithm evaluation table \(71.5 kB\)](#)

Best Parameters

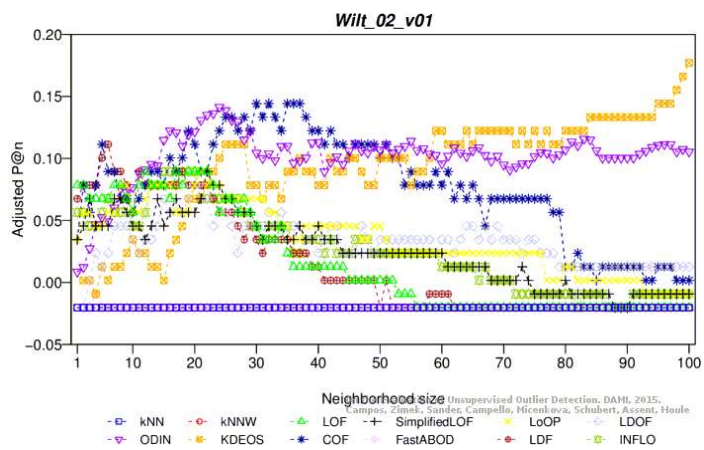
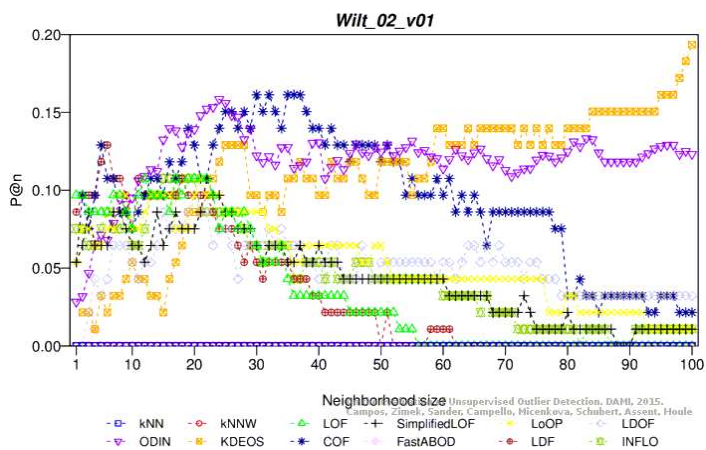
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Algorithm	k	P@n	Adj. P@n	AP	Adj. AP	Max-F1	Adj. MF1	ROC AUC
KNN	1	0.00000	-0.02031	0.04237	0.02292	0.10177	0.08353	0.76985
KNNW	1	0.00000	-0.02031	0.03791	0.01836	0.09284	0.07441	0.70262
KNNW	4	0.00000	-0.02031	0.04114	0.02166	0.09728	0.07894	0.76635
KNNW	7	0.00000	-0.02031	0.04080	0.02131	0.10046	0.08218	0.76956
KNNW	8	0.00000	-0.02031	0.04063	0.02114	0.10018	0.08190	0.76999
LOF	12	0.10753	0.08940	0.08091	0.06224	0.16000	0.14294	0.84574
LOF	19	0.10753	0.08940	0.08791	0.06938	0.17257	0.15576	0.85959
LOF	26	0.08602	0.06745	0.08412	0.06551	0.17931	0.16264	0.85501
SimplifiedLOF	22	0.10753	0.08940	0.08097	0.06230	0.15873	0.14164	0.85652
SimplifiedLOF	29	0.07527	0.05648	0.08206	0.06342	0.17496	0.15820	0.86517
SimplifiedLOF	34	0.06452	0.04551	0.08288	0.06425	0.16960	0.15273	0.86655
LoOP	21	0.10753	0.08940	0.07775	0.05901	0.15385	0.13666	0.84489
LoOP	32	0.07527	0.05648	0.08161	0.06295	0.17638	0.15965	0.86111
LoOP	34	0.06452	0.04551	0.08239	0.06375	0.17523	0.15847	0.86299
LDOF	20	0.09677	0.07843	0.06306	0.04403	0.14758	0.13027	0.78984
LDOF	54	0.05376	0.03454	0.07448	0.05568	0.15934	0.14226	0.85712
LDOF	56	0.05376	0.03454	0.07506	0.05627	0.15584	0.13870	0.85758
ODIN	24	0.15854	0.14145	0.10433	0.08614	0.17252	0.15571	0.85794
ODIN	34	0.12750	0.10977	0.10031	0.08203	0.17771	0.16101	0.86053
ODIN	59	0.12043	0.10256	0.09078	0.07231	0.18861	0.17212	0.84321
FastABOD	3	0.00000	-0.02031	0.03110	0.01141	0.07657	0.05781	0.65325
FastABOD	4	0.01075	-0.00934	0.02944	0.00973	0.06814	0.04921	0.64775
FastABOD	16	0.00000	-0.02031	0.02883	0.00911	0.06523	0.04624	0.65390
KDEOS	99	0.18280	0.16619	0.10926	0.09116	0.19792	0.18162	0.83673
KDEOS	100	0.19355	0.17717	0.10932	0.09123	0.19672	0.18040	0.83640
LDF	6	0.12903	0.11134	0.07280	0.05397	0.15649	0.13935	0.80496
LDF	14	0.09677	0.07843	0.08863	0.07012	0.16556	0.14861	0.86009
LDF	18	0.10753	0.08940	0.08991	0.07142	0.17837	0.16168	0.85685
LDF	24	0.07527	0.05648	0.08403	0.06542	0.18219	0.16558	0.84894
INFLO	15	0.10753	0.08940	0.06495	0.04596	0.14570	0.12834	0.76322
INFLO	26	0.08602	0.06745	0.07214	0.05329	0.16927	0.15239	0.80602
INFLO	27	0.08602	0.06745	0.07248	0.05364	0.16704	0.15012	0.80754
COF	24	0.13978	0.12231	0.11739	0.09946	0.24478	0.22943	0.87169
COF	25	0.15054	0.13328	0.11663	0.09869	0.23529	0.21976	0.87222
COF	30	0.16129	0.14425	0.11410	0.09610	0.21705	0.20115	0.86650

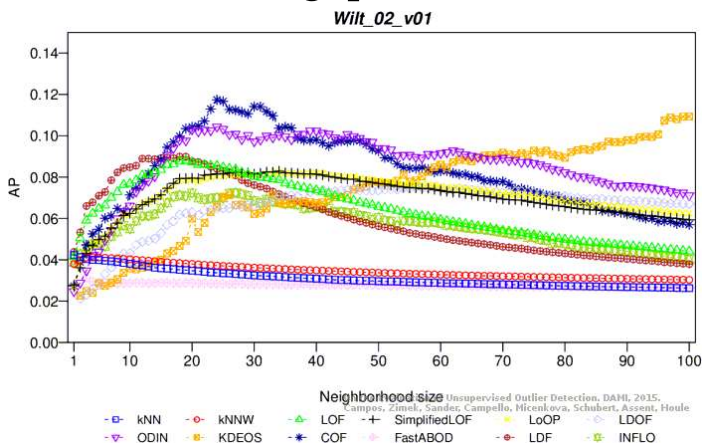
Plots

Precision at n

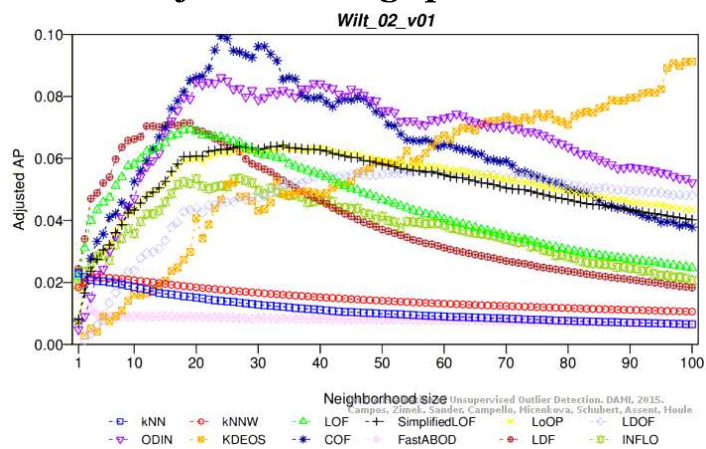
Adjusted precision at n



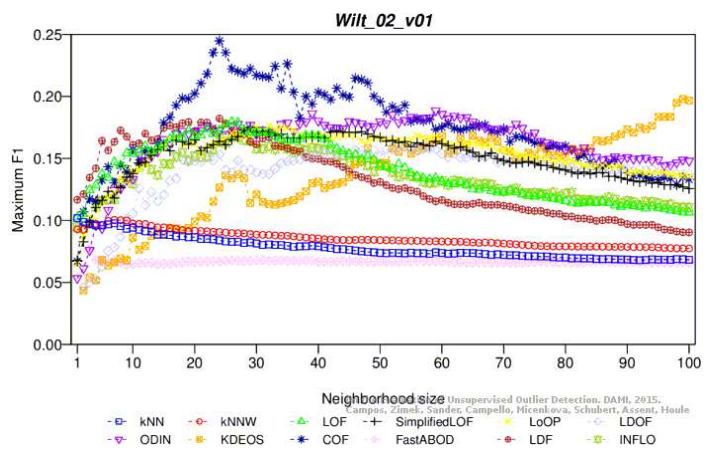
Average precision



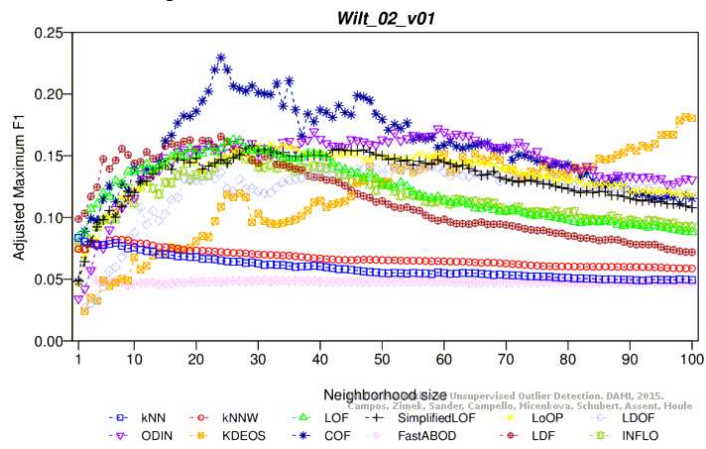
Adjusted average precision



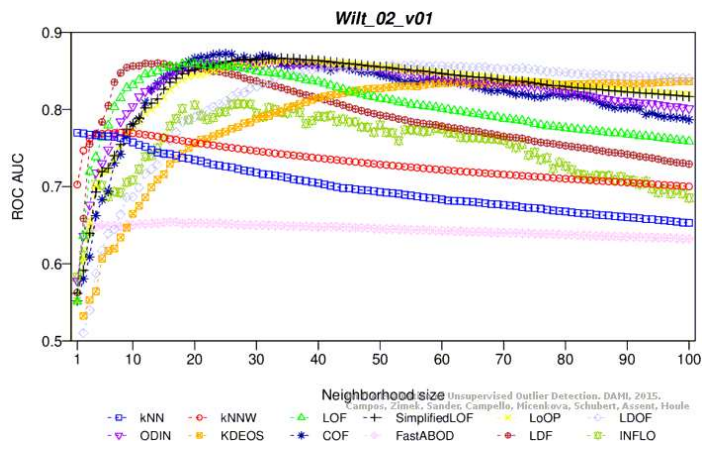
Maximum F1 score



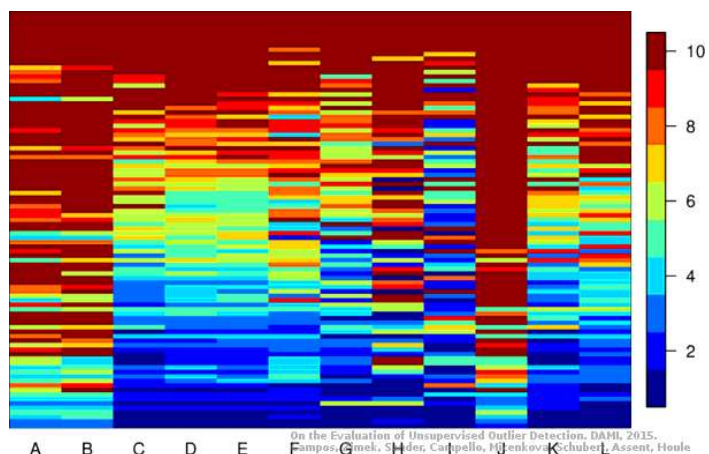
Adjusted maximum F1 score



ROC AUC



Diversity



A: KNN, B: KNNW, C: LOF, D: SimplifiedLOF, E: LoOP, F: LDOF

G: ODIN, H: KDEOS, I: COF, J: FastABOD, K: LDF, L: INFLO

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