

Appendix A

Num	Name	PCA	MDS	t-SNE	UMAP	Isomap	LE	LLE	LAMP	NMF	LDA	FA	SAM
1	Rauber,EuroVis_2016 [34]			✓									
2	Amorim,PacificVis_2016 [1]								✓				
3	Guo,PacificVis_2014 [13]		✓										
4	Zhou,PacificVis_2016 [50]		✓										
5	Shen,PacificVis_2020 [36]			✓									
6	Yue,TVCG_2019 [45]			✓									
7	Natsukawa,TVCG_2020 [25]	✓	✓	✓		✓		✓					
8	Choo,TVCG_2013 [10]			✓						✓			
9	Fujiwara,TVCG_2020 [12]	✓			✓								
10	Han,TVCG_2018 [14]			✓									
11	Kahng,TVCG_2017 [17]			✓									
12	Rauber,TVCG_2016 [33]			✓									
13	Bernard,TVCG_2017 [3]	✓	✓	✓									✓
14	Pezzotti,TVCG_2016 [31]			✓									
15	Cavallo,TVCG_2018 [7]	✓	✓	✓		✓		✓					
16	Stahnke,TVCG_2015 [38]		✓	✓									
17	Kwon,TVCG_2018 [21]	✓	✓	✓									
18	Somarakis,TVCG_2019 [37]			✓									
19	Yuan,TVCG_2013 [44]	✓	✓										
20	Cao,TVCG_2011 [5]		✓										
21	Elzen,TVCG_2015 [39]	✓	✓	✓									
22	Oesterling,TVCG_2012 [27]	✓											
23	Krueger,TVCG_2019 [19]	✓			✓								
24	Liu,TVCG_2018 [24]	✓		✓									
25	Wang,TVCG_2017 [40]	✓											
26	Kwon,TVCG_2019 [20]			✓									
27	Han,TVCG_2015 [15]			✓									
28	Bach,TVCG_2015 [2]		✓										
29	Zhao,TVCG_2019 [49]			✓									
30	Kim,TVCG_2016 [18]			✓									
31	Zhao,TVCG_2019 [48]			✓									
32	Cheng,TVCG_2016 [9]		✓										
33	Li,TVCG_2019 [23]			✓							✓		
34	Wang,TVCG_2017 [41]	✓	✓	✓							✓		
35	Oesterling,TVCG_2010 [28]										✓		
36	Pobitzer,TVCG_2012 [32]											✓	
37	Favelier,TVCG_2018 [111]						✓						
38	Bhattacharya,TVCG_2017 [4]						✓						
39	Rossl,TVCG_2011 [35]		✓										
40	Orban,TVCG_2018 [29]	✓	✓										
41	Yang,TVCG_2020 [43]			✓									
42	Park,TVCG_2019 [30]			✓									
43	Chaudhuri,TVCG_2014 [8]	✓	✓										
44	Zhao,TVCG_2020 [47]		✓										
45	Castermans,TVCG_2018 [6]		✓	✓									
46	Nocaj,TVCG_2012 [26]		✓										
47	Zeng,TVCG_2019 [46]			✓									
48	Xu,TVCG_2019 [42]			✓									
49	Höhl,TVCG_2017 [16]			✓									
50	Lekschas,TVCG_2017 [22]			✓									
51	Zhou,TVCG_2018 [51]			✓									
Total		14	19	30	2	2	2	2	1	1	4	1	1

Table 1: Dimensionality reduction approaches used for visual cluster analysis

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