# k-Nearest Neighbour

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#### **k**NN

Method to STORE all available cases and CLASSIFIES new ones based on a SIMILARITY measure

#### **kNN**

also can be used to

INTERPOLATE and EXTRAPOLATE

quantitative data

#### Specification

(Moore 1991)

MDS Domain \* Range

Exemplar-Set E

Exemplar member

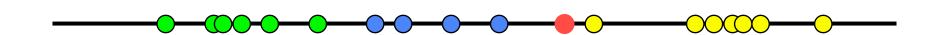
Target domain vector d

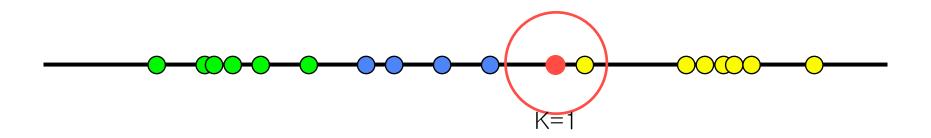
None-nearer(E,d,d')  $\Leftrightarrow \forall (d'',r'') \in E \mid d-d' \mid \leq \mid d-d'' \mid$ 

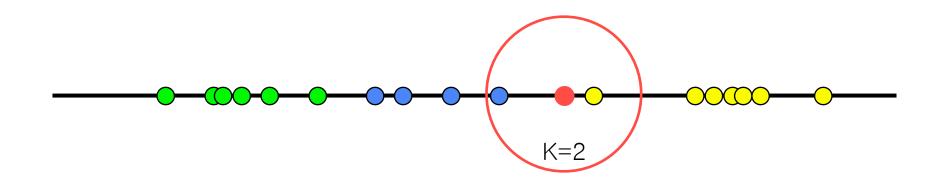
#### Lazy Learning

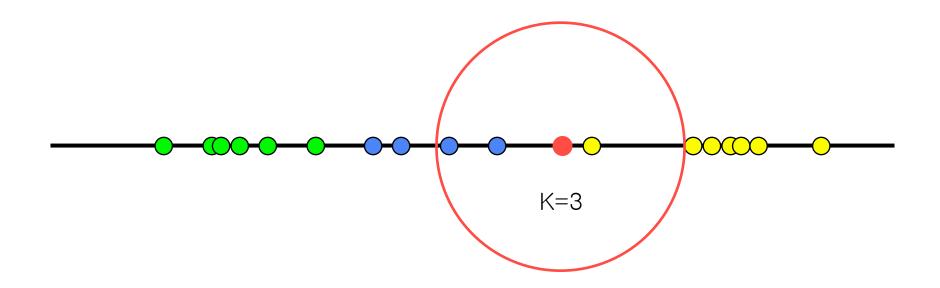
No query, no work

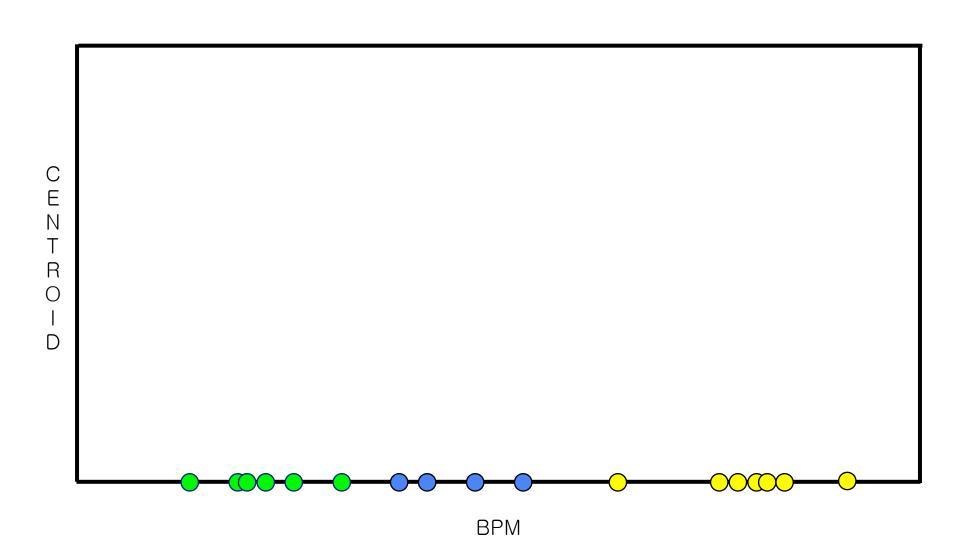


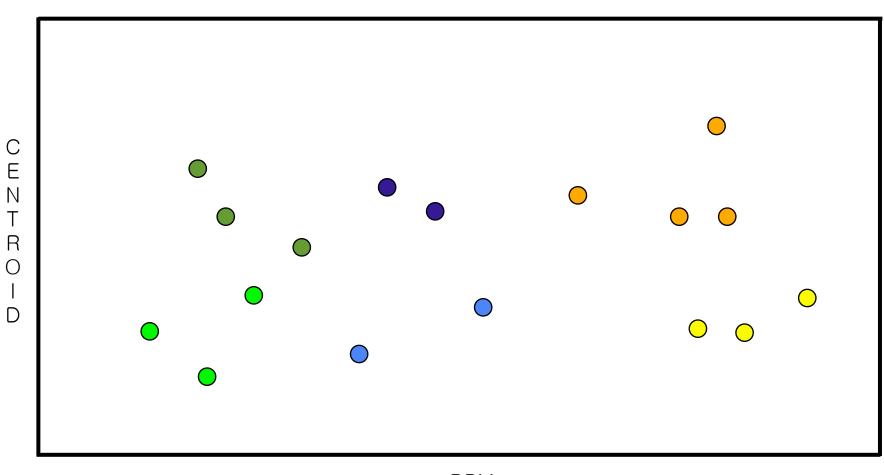




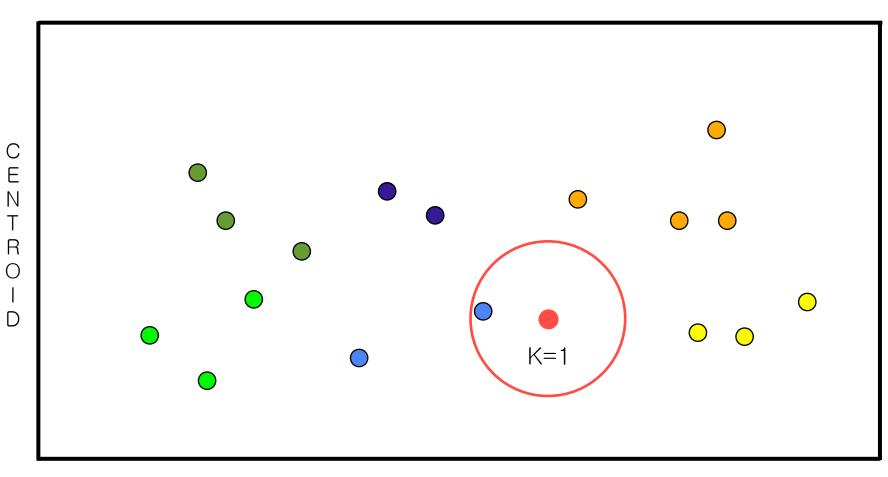




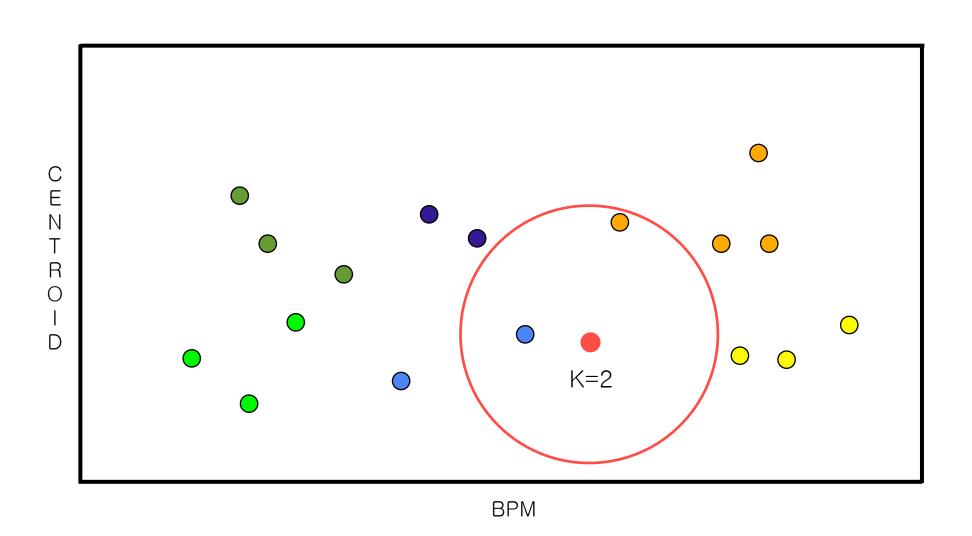


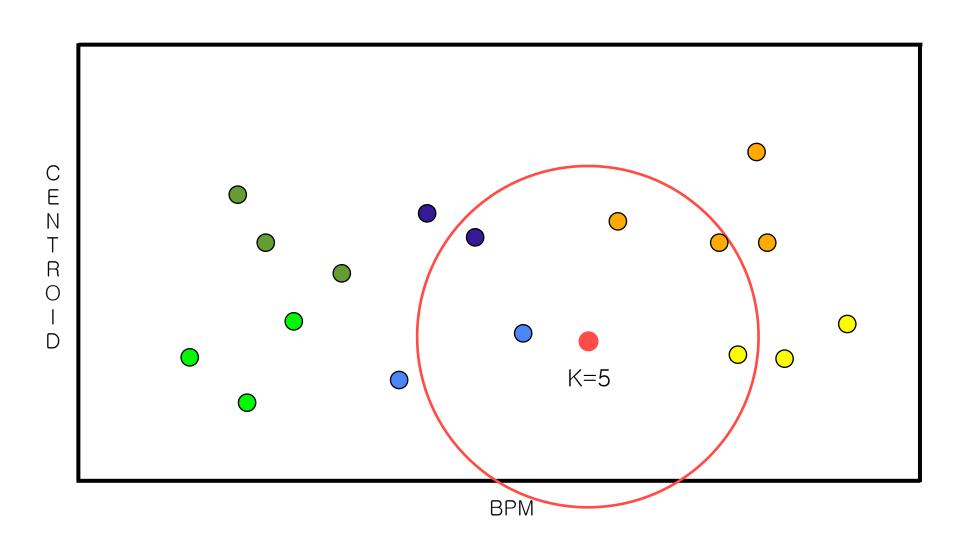


BPM



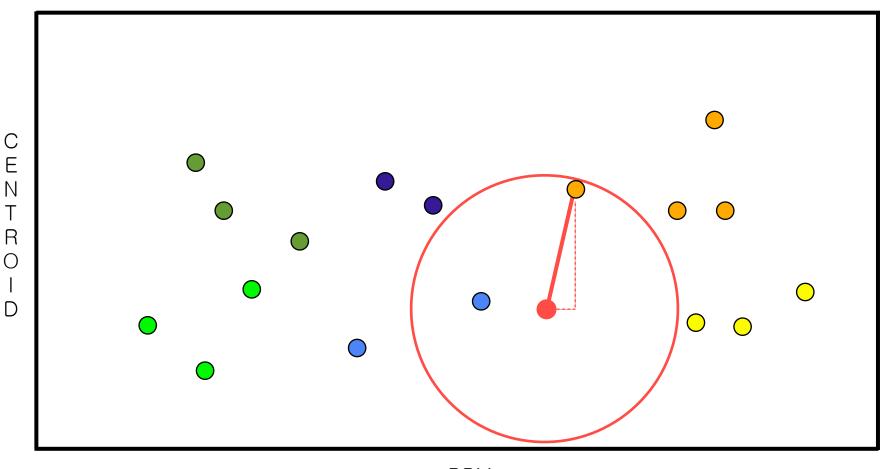
BPM



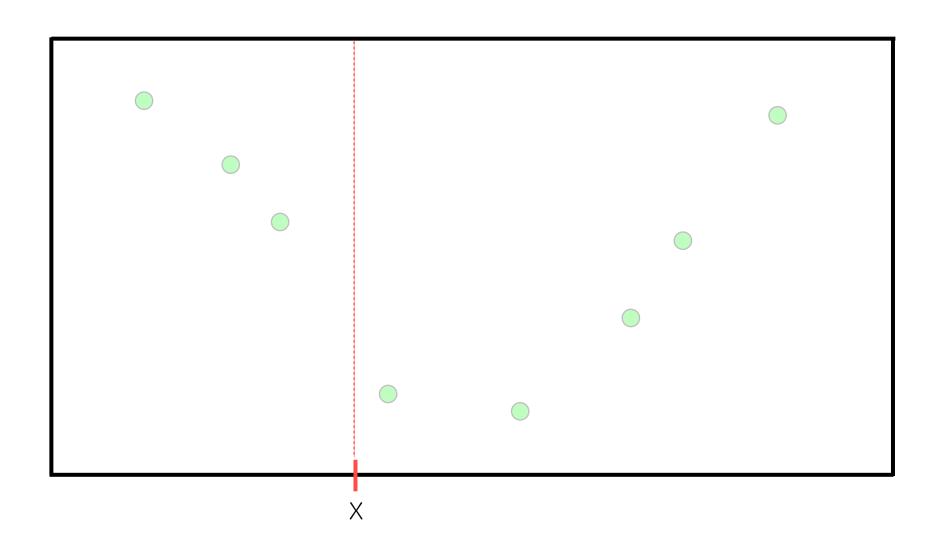


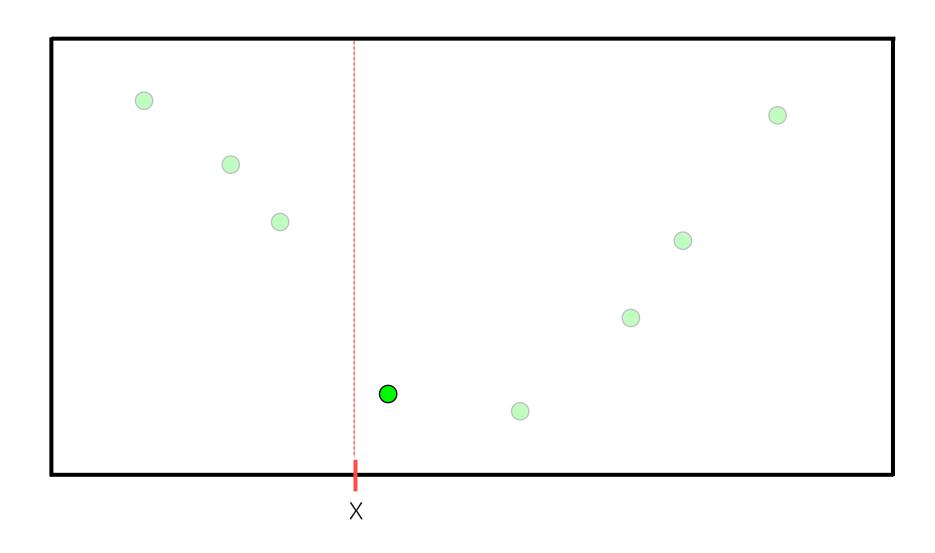
#### Distance Calculation

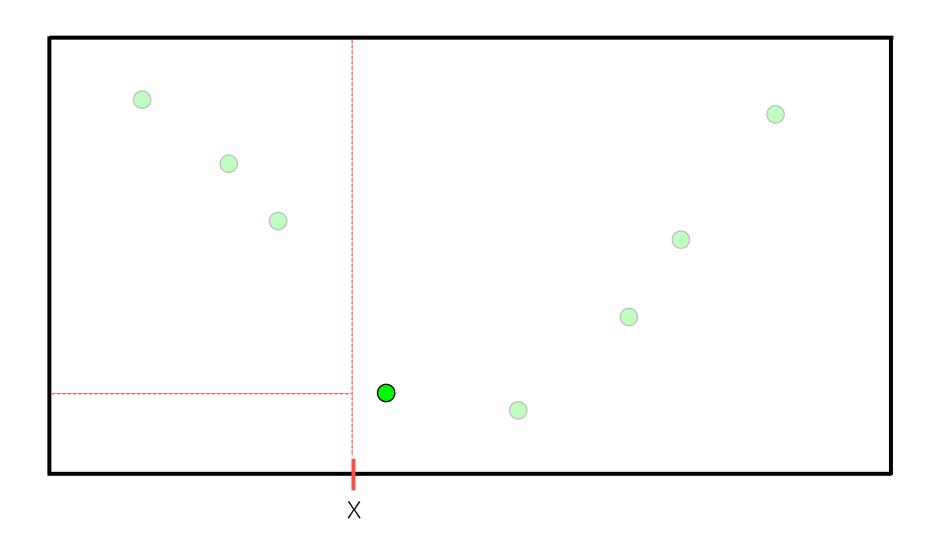
$$|d-d'| = \sqrt{\sum_{i=1}^{k_d} (d_i - d'_i)^2}$$

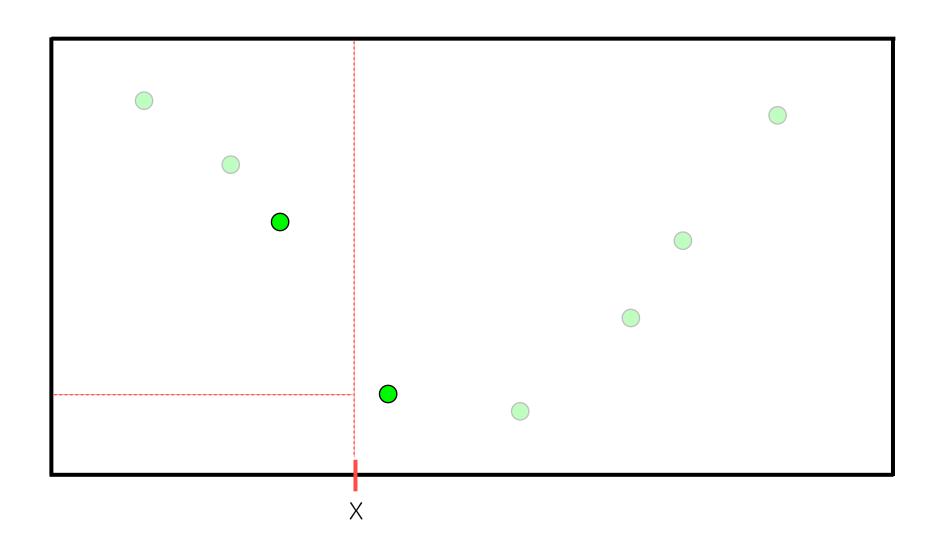


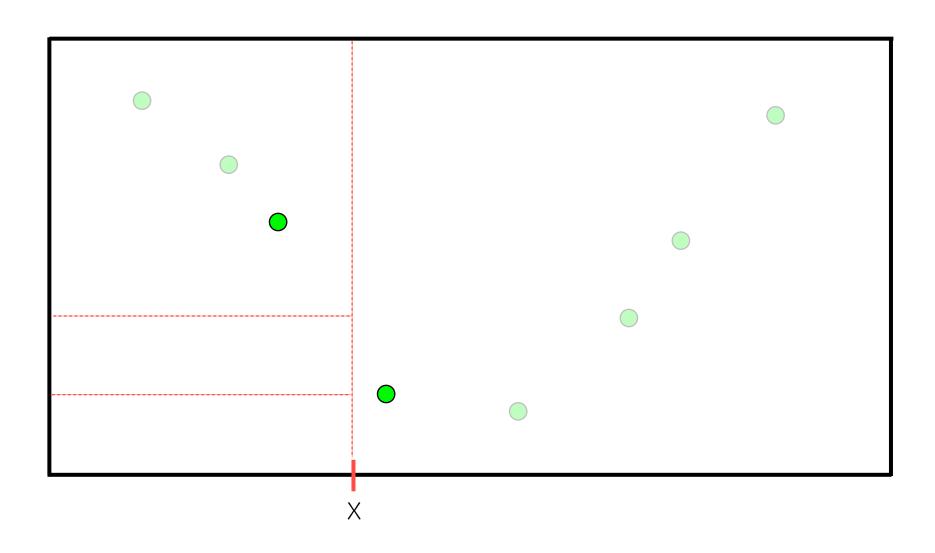
**BPM** 

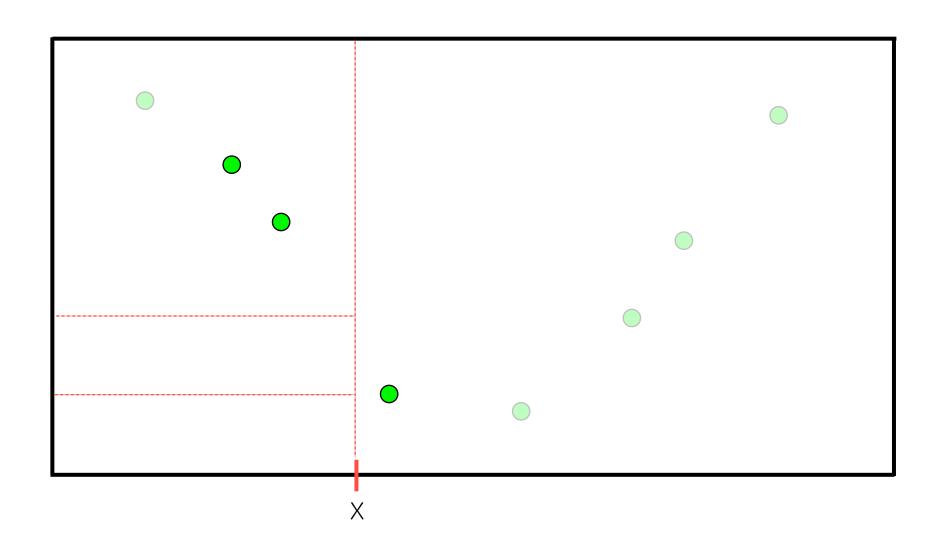


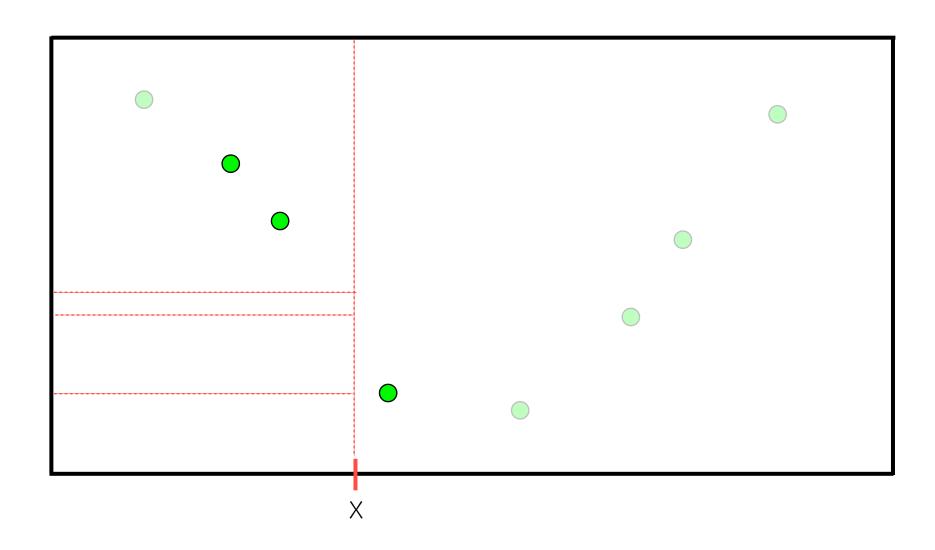


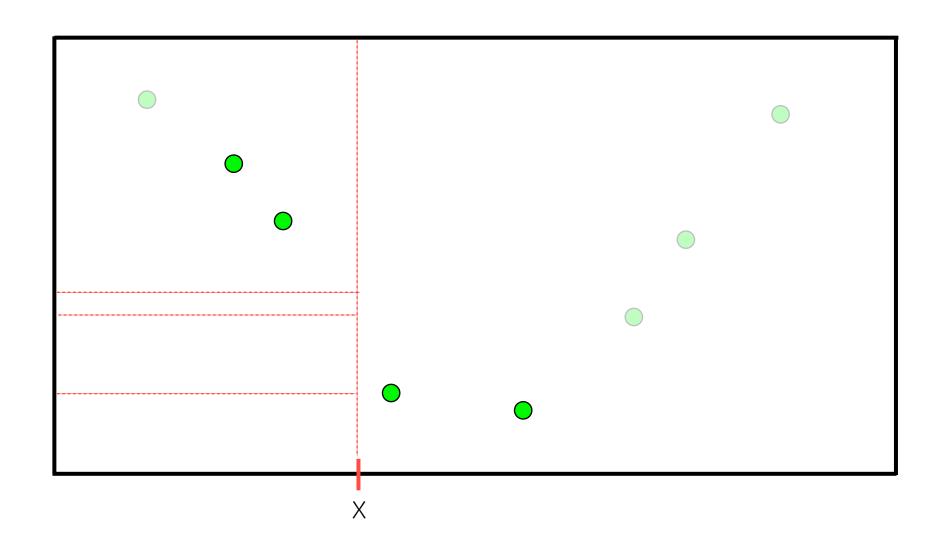


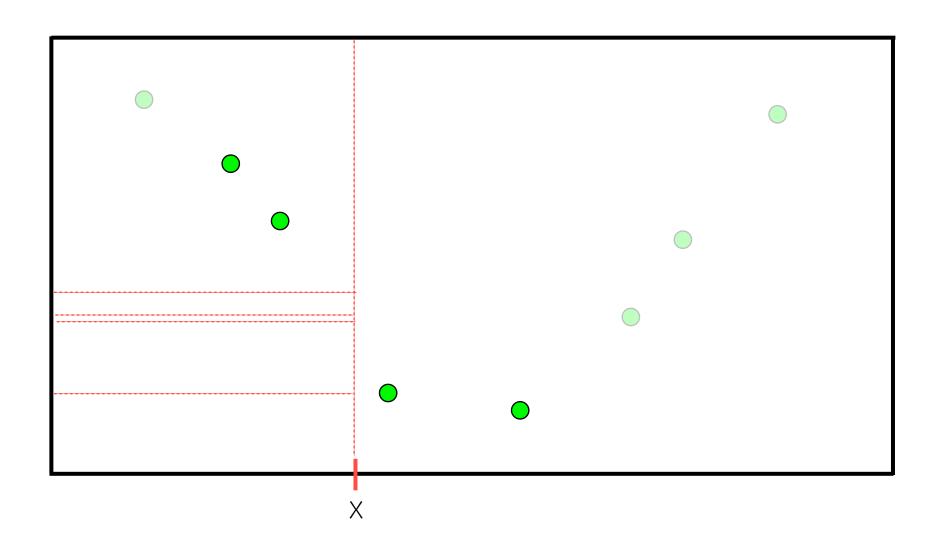


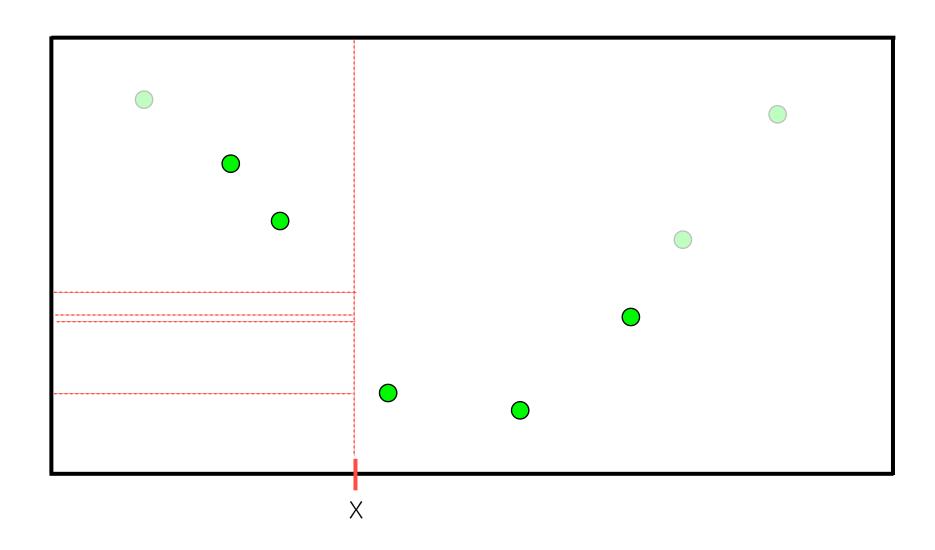


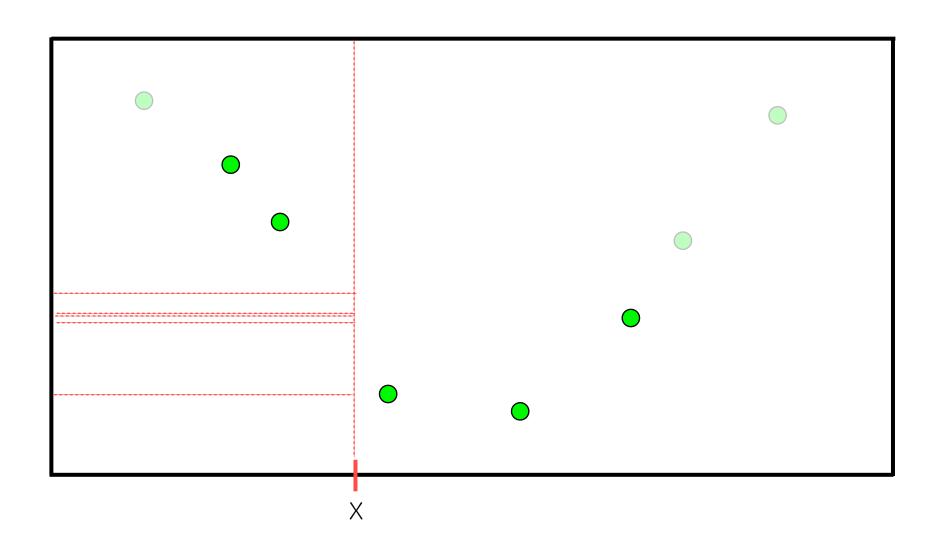


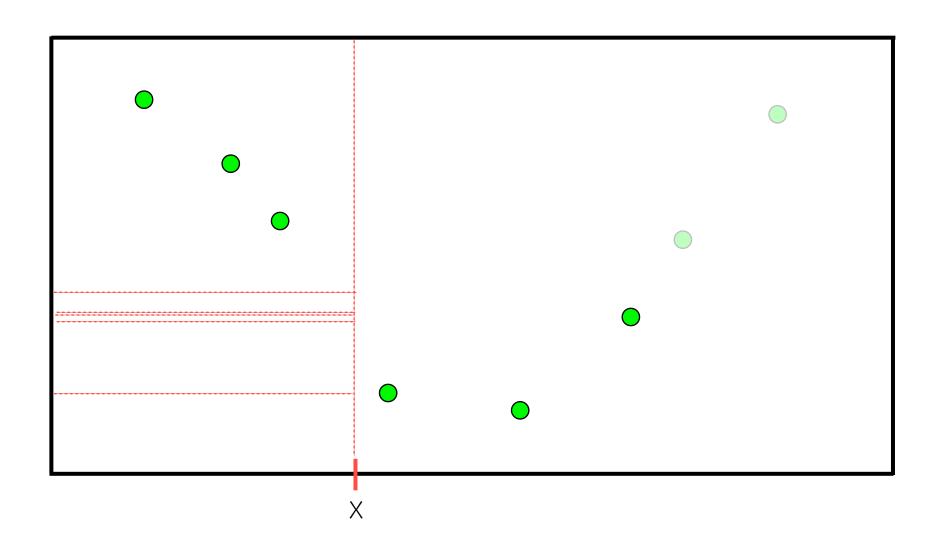


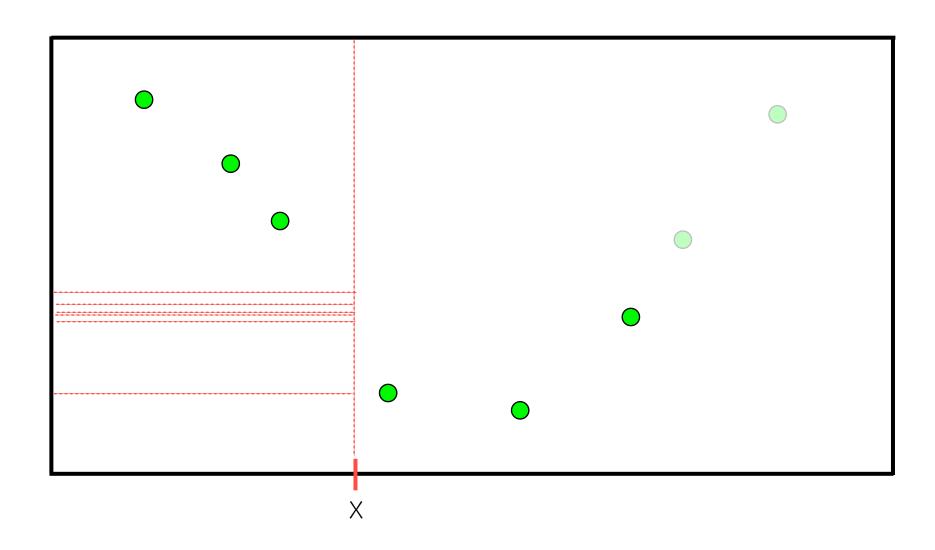


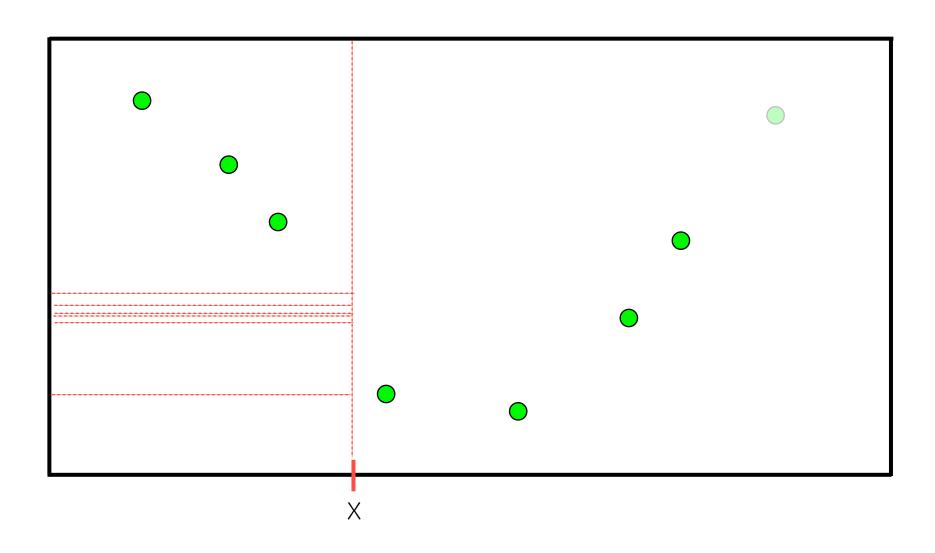


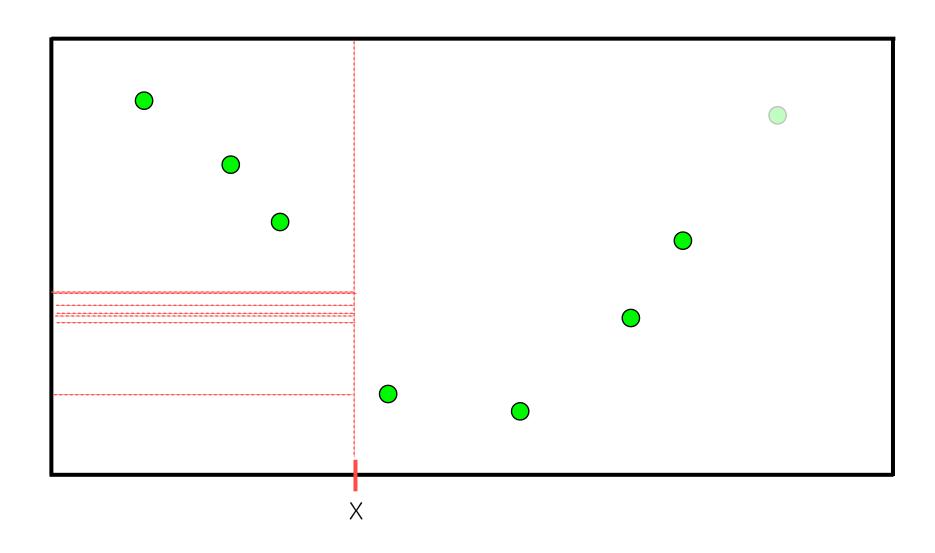


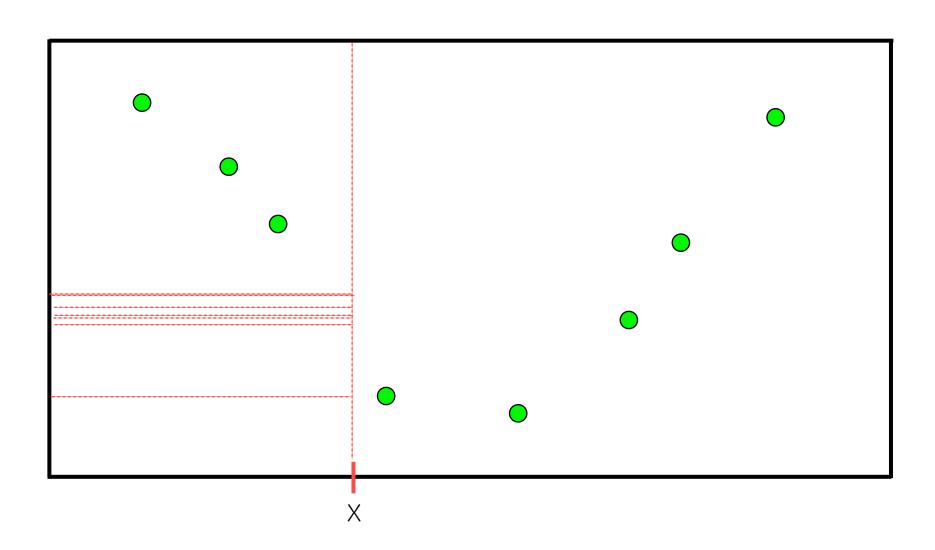


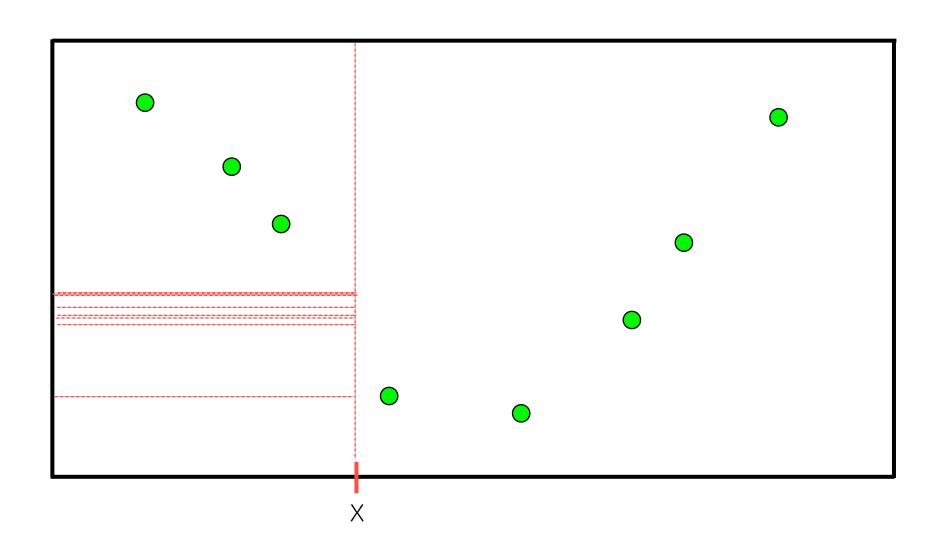




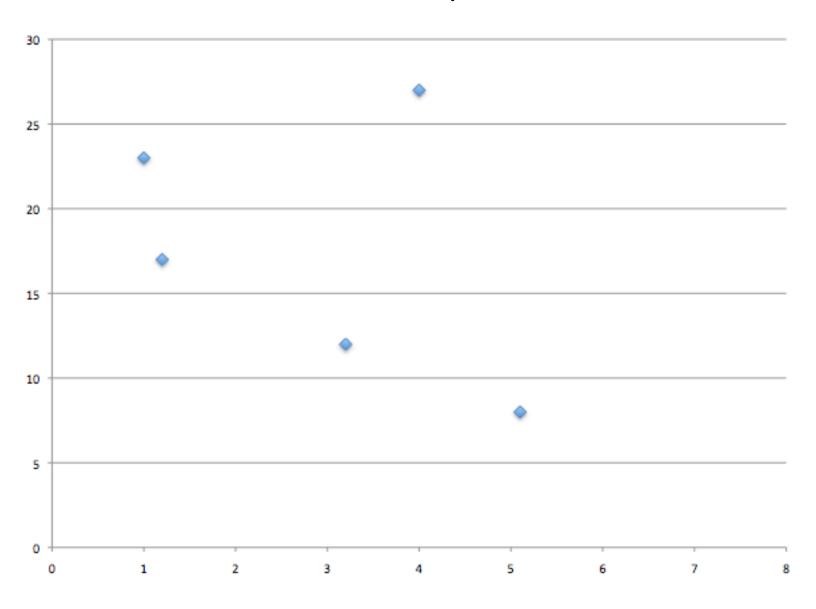




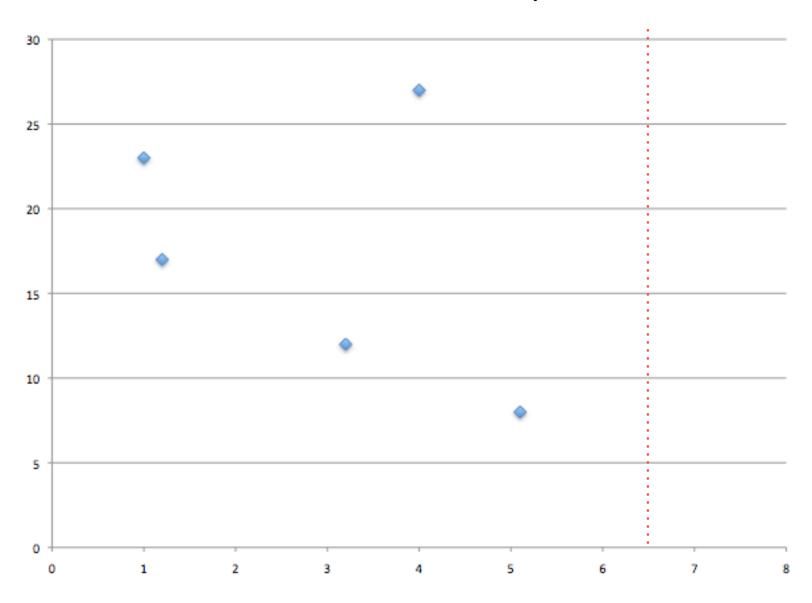




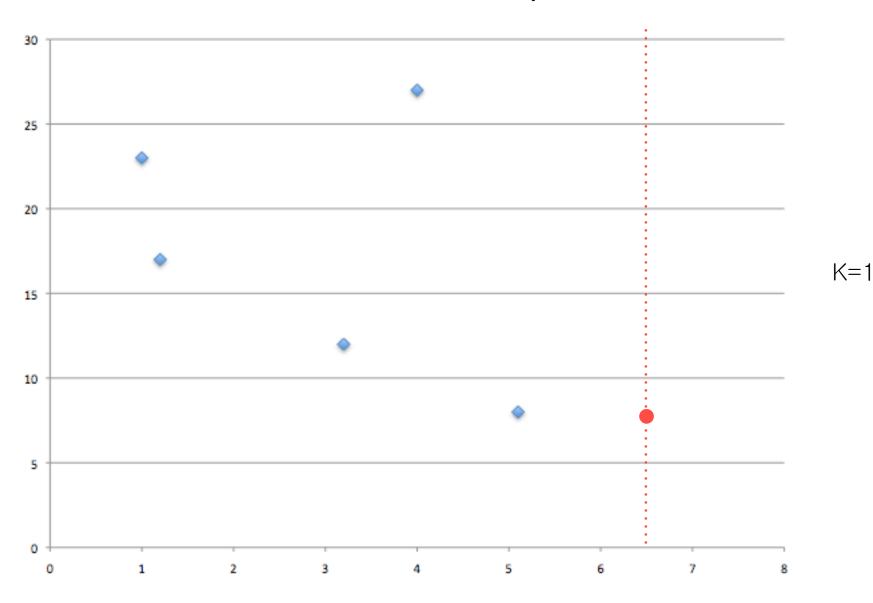
#### Extra-polation

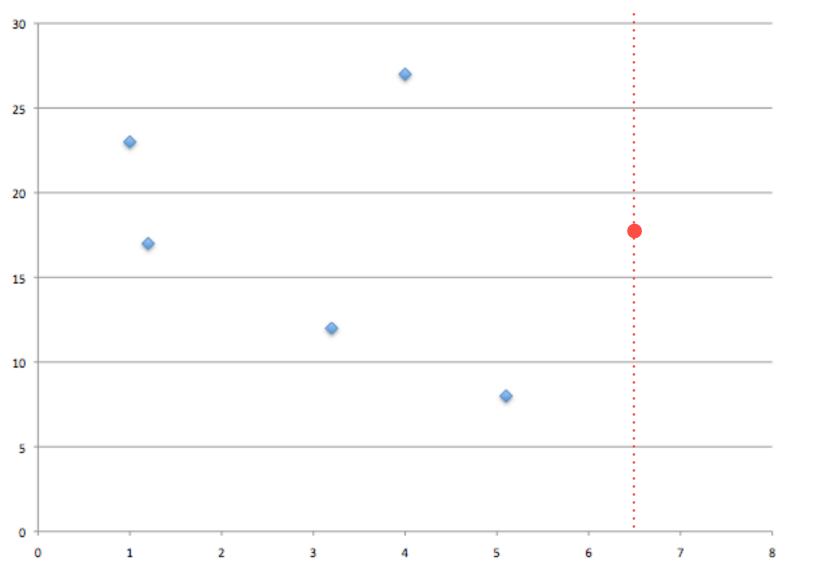


#### Inter/Extra-polation

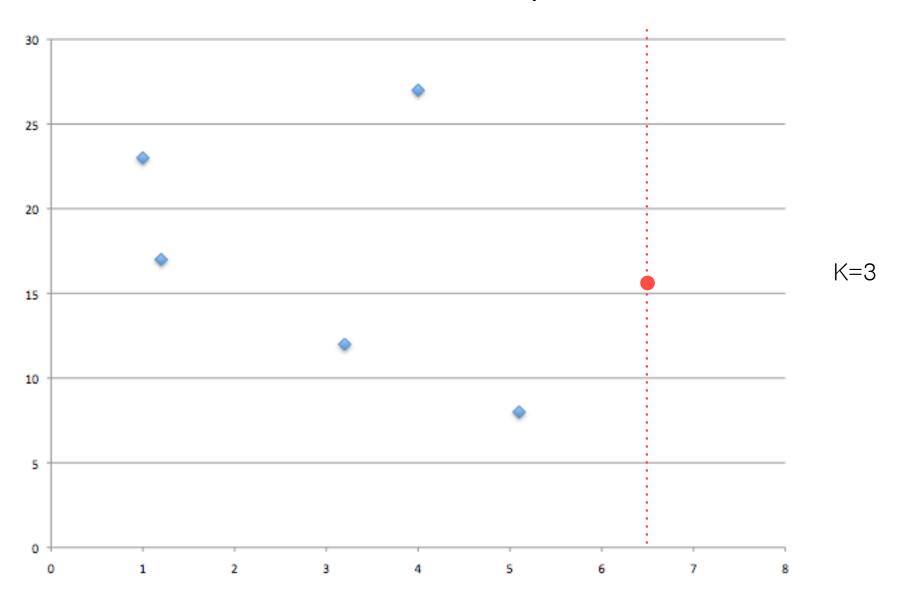


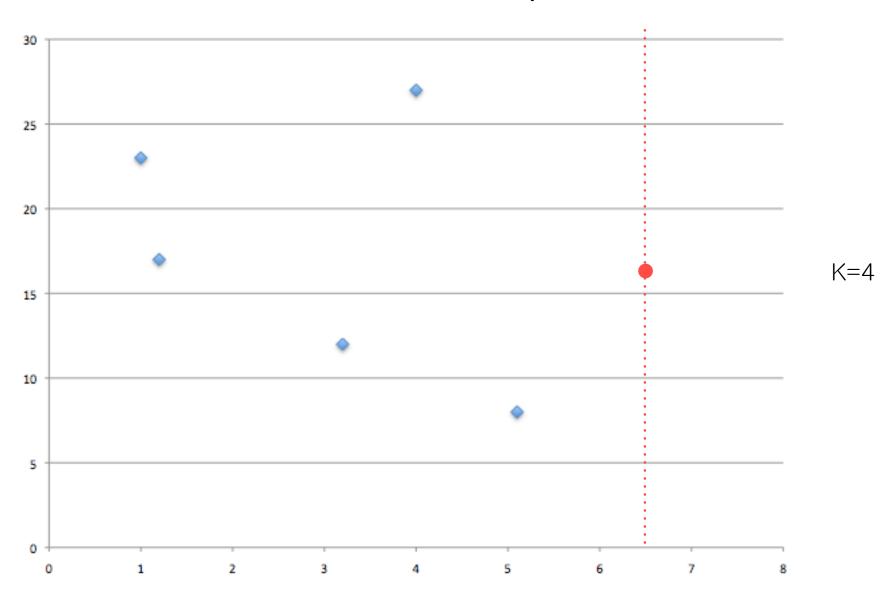
#### Inter/Extra-polation

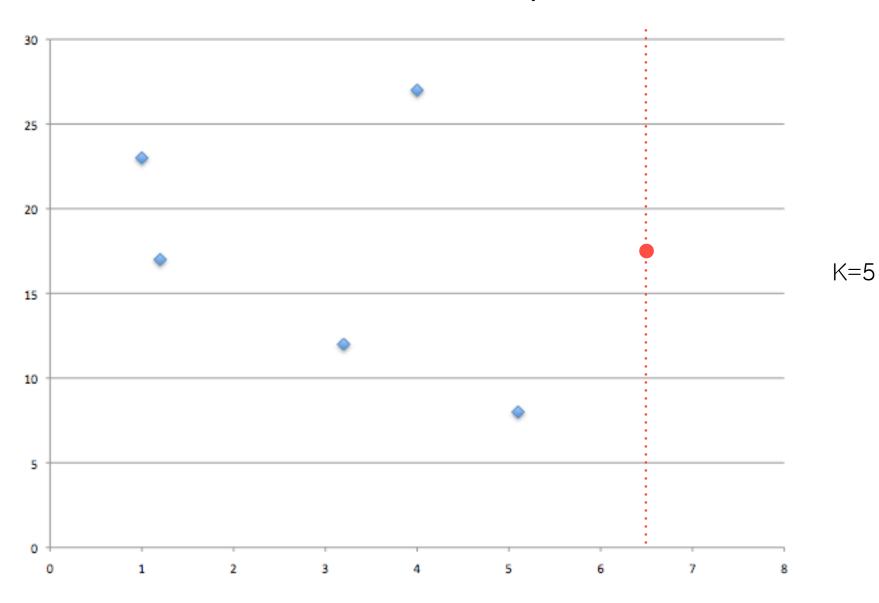




K=2







## 1st SC /kNN

Sound Classification

Sound Features

jAudio - Excel

#### Sound categories

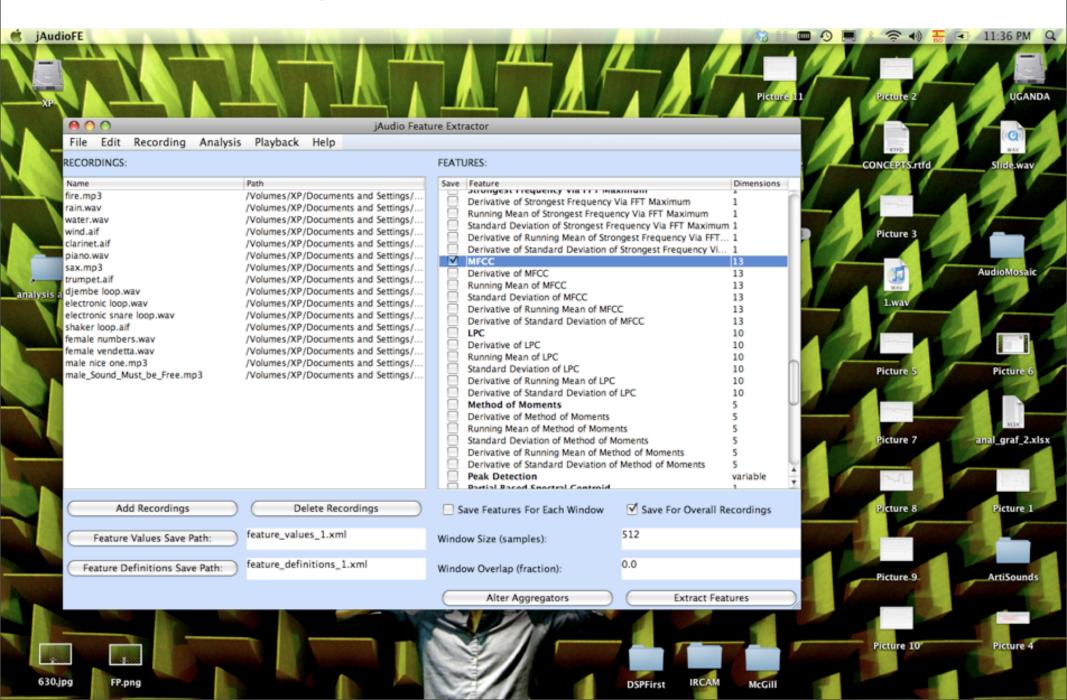
Vocal Harmonic Sounds Instruments Percussion Sounds

#### Features

Spectral Centroid

13 MFCC

## jAudio -> xml



## xml -> Excel

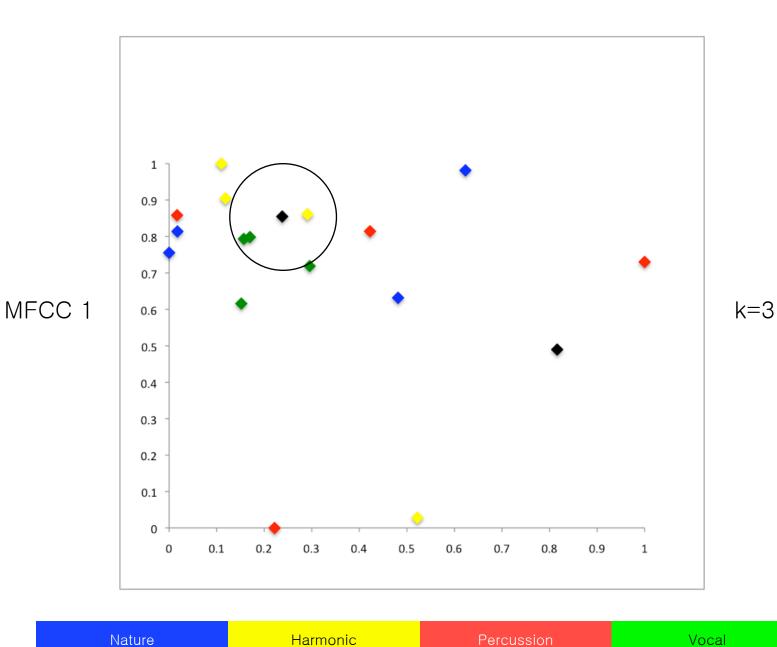
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1	comme	nts data_se	et_id								name			v	
2		C:\Docu	ments and	Settings\	Gabriel\!	My Docum	nents\Dow	nloads\a	nalysis\fxs\fire	e.mp3	Spectral Cen	troid Overal	Standard D	e 17.39	1
3		C:\Docu	uments and	Settings\	Gabriel\!	My Docum	nents\Dow	nloads\a	nalysis\fxs\fire	e.mp3	MFCC Overa	II Standard	Deviation	62.28	
4		C:\Docu	uments and	Settings\	GabrielM	My Docum	nents\Dow	nloads\a	nalysis\fxs\fire	e.mp3	MFCC Overa			5.795	i
5									nalysis\fxs\fire		MFCC Overa			2.303	
6									nalysis\fxs\fire		MFCC Overa			1.756	
7									nalysis\fxs\fire		MFCC Overa			1.715	
8									nalysis\fxs\fire		MFCC Overa			1.646	
9									nalysis\fxs\fire		MFCC Overa			1.399	
10									nalysis\fxs\fire		MFCC Overa			1.307	
11									nalysis\fxs\fire		MFCC Overa			1.264	
12									nalysis\fxs\fire		MFCC Overa			1.357	
13									nalysis\fxs\fire		MFCC Overa			1.1	
14									nalysis\fxs\fire		MFCC Overa			1.061	
15									nalysis\fxs\fire		MFCC Overa			1.08	
16									nalysis\fxs\fire		Spectral Cen		l Average	6.692	
17									nalysis\fxs\fire		MFCC Overa	_		-151.7	
18									nalysis\fxs\fire		MFCC Overa	_		3.317	
19									nalysis\fxs\fire		MFCC Overa	_		6.039	
20									nalysis\fxs\fire		MFCC Overa	_		2.894	
21									nalysis\fxs\fire		MFCC Overa	_		2.076	
22									nalysis\fxs\fire		MFCC Overa	_		2.788	
23				_		•			nalysis\fxs\fire		MFCC Overa	_		1.649	
24									nalysis\fxs\fire		MFCC Overa			1.023	
25				_		•			nalysis\fxs\fire		MFCC Overa			0.3397	
26									nalysis\fxs\fire		MFCC Overa			-0.03431	
27									nalysis\fxs\fire		MFCC Overa			0.2651	
28									nalysis\fxs\fire		MFCC Overa			-0.2784	
29									nalysis\fxs\fire		MFCC Overa			-0.291	
30									nalysis\fxs\rai						
31									nalysis\fxs\rai					3.595	
32									nalysis\fxs\rai					1.545	
33		C:\Doci	iments and	Settings\	Gabriel	Av Docum	nents\Daw	ninaris\a	nalysis\fxs\rai	n wav	MECC Overa	III Standard	Deviation	1.509	

## Ordered

1																
name	fire	rain	water	wind	piano	sax	trumpet	clarinet	djembe	electronic	snare	shaker	fem num		male nice	male free
Spectral Centroid Overall Standard De		8.137	48.39	4.404	5.066	14.01	36.35	2.949	4.93		31.28	23.67	23.37	67.58	37.73	38.12
MFCC Overall Standard Deviation	62.28	3.595	50.48	112	13.43	29.59	344.4	7.498	19.15		369	24.2		99.53	165.5	152.9
MFCC Overall Standard Deviation	5.795	1.545	8.412	4.662	2.936	7.732	10.89	3.377	3.273	3.943	4.78	2.6		8.863	9.565	9.678
MFCC Overall Standard Deviation	2.303	1.509	6.941	2.756	2.203	4.552	3.236	1.292	4.305		2.696	1.999			5.473	6.085
MFCC Overall Standard Deviation	1.756	1.473	5.196	3.254	3.178	3.081	2.767	3.569	2.447	2.074	2.656	1.988	4.304	3.058	4.499	5.422
MFCC Overall Standard Deviation	1.715	1.43	3.68	2.357	2.699	2.46	3.605	3.807	2.52	1.919	1.759	1.486		3.128	2.946	4.282
MFCC Overall Standard Deviation	1.646	1.331	3.318	1.579	2.2	3.533	2.883	4.932	2.152	1.568	1.476	1.673	2.286	2.605	2.429	2.763
MFCC Overall Standard Deviation	1.399	1.402	3.328	1.472	2.067	4.773	4.938	4.571	2.258	1.907	1.379	1.384	3.069	2.229	1.614	2.21
MFCC Overall Standard Deviation	1.307	1.245	2.537	1.564	1.923	3.38	5.221	1.738	2.138	1.436	1.003	1.482	1.911	2.081	2.79	3.02
MFCC Overall Standard Deviation	1.264	1.176	2.702	1.872	2.589	3.983	6.373	4.086	1.987	1.606	1.763	1.249	2.143	1.586	1.747	2.226
MFCC Overall Standard Deviation	1.357	1.171	2.12	1.418	2.362	5.286	4.457	4.196	1.758	1.199	1.56	1.255	1.995	1.971	1.757	1.921
MFCC Overall Standard Deviation	1.1	1.061	1.997	1.487	2.755	5.647	6.897	2.95	1.248	1.18	0.9551	1.221	2.763	1.643	1.251	1.997
MFCC Overall Standard Deviation	1.061	1.065	2.063	1.257	2.768	4.847	5.83	2.338	1.456	1.382	1.322	1.291	2.861	1.7	1.287	1.662
MFCC Overall Standard Deviation	1.08	1.052	1.887	1.185	1.961	6.503	3.172	5.629	1.501	0.9836	1.262	1.101	2.481	2	1.083	1.226
Spectral Centroid Overall Average	6.692	88.38	69.27	4.343	20.33	43.58	74.76	19.19	6.591	61.32	34.24	139.2	27.26	44.19	24.81	25.52
MFCC Overall Average	-151.7	-119	-187.2	-163.1	-134	-142.5	-304.9	-115.4	-143	-151.6	-310.4	-168	-154.7	-170.2	-190.3	-155.7
MFCC Overall Average	3.317	-10.73	-3.722	12.1	9.902	-11.65	-19.74	-1.75	12.99	-8.766	-0.3105	-10.76	9.9	5.799	6.397	9.072
MFCC Overall Average	6.039	-2.44	0.4847	-3.387	-2.785	-1.751	-2.384	-4.638	-4.436		2.342	0.83		5.819	8.172	7.34
MFCC Overall Average	2.894	-1.168	0.8538	-5.971	-1.385	-0.3065	-4.128	0.4007	-2.174	1.157	-4.621	-1.236	-6.244	0.5014	1.045	0.9084
MFCC Overall Average	2.076	0.2791	-1.003	-3.183	-3.823	-1.957	-0.2204	-1.506	-3.497	-0.2269	0.4827	0.1407	-7.418	-0.2531	1.026	1.478
MFCC Overall Average	2.788	-0.5914	-0.2119	-0.4327	-1.797	-1.242	1.296	-6.32	-1.409	1.009	1.145	-0.6327	3.265	2.121	0.2149	-0.02195
MFCC Overall Average	1.649	-1.339	0.2892	0.1324	0.3895	4.6	0.6498	-10.16	-1.168	0.2287	0.3788	0.0654	-5.348	0.165	0.8109	-0.1794
MFCC Overall Average	1.023	0.3403	-0.861	-0.6493	2.067	6.555	-0.9873	-6.426	-0.2094	0.436	0.1924	0.1709	2.391	0.302	0.209	-0.4256
MFCC Overall Average	0.3397	-0.3888	0.6136	-1.636	1.868	4.359	-1.225	-5.321	1.432	-0.1814	-2.394	-0.197	-3.256	-0.8859	-1.508	-0.3424
MFCC Overall Average	-0.03431	-0.6919	0.475	-1.347	-1.951	-2.75	0.1803	-2.773	1.013	-1.201	-1.751	-0.7641	2.08	1.17	-0.8064	-0.454
MFCC Overall Average	0.2651	-0.1874	-0.7319	0.5336	-2.334	-7.767	-0.5475	2.032	-0.4514	-0.488	-0.6609	-0.04709	-1.779	-1.386	0.3591	-0.5013
MFCC Overall Average	-0.2784	-0.5661	-0.172	1.179	-1.725	-4.691	-2.239	2.88	-0.5157	-0.2104	1.048	-0.3109	-0.4405	0.2095	-1.129	-0.2333
MFCC Overall Average	-0.291	-0.235	-0.6956	1.265	-0.7022	1.638	0.1647	4.315	0.03571	-0.03586	0.5892	-0.837	-2.2	-0.2011	-0.1452	-0.2907

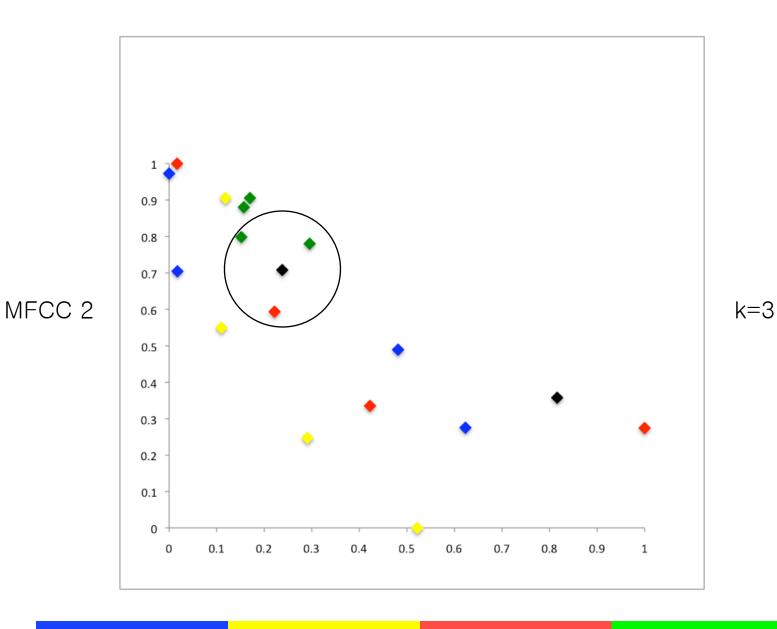
### Normalized

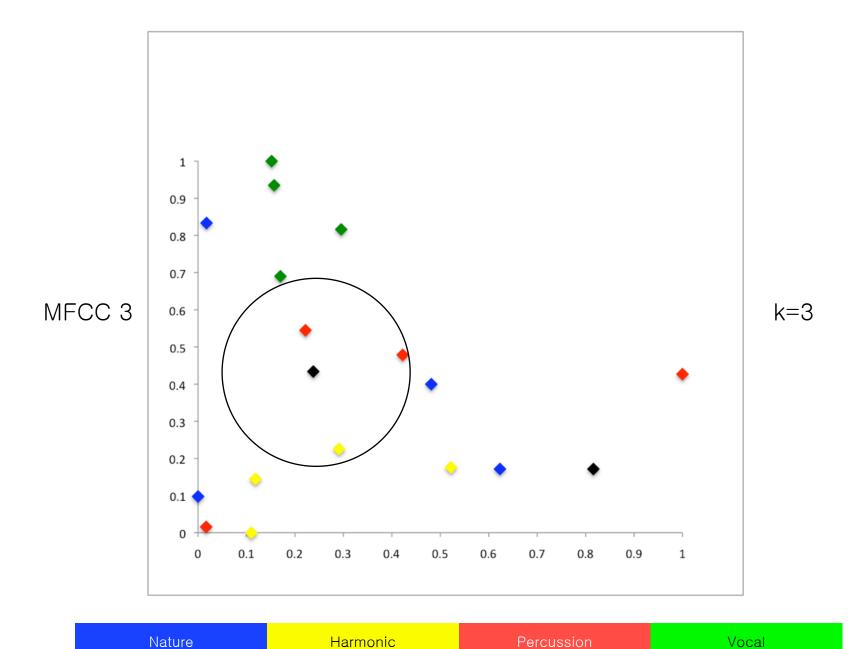
name	fire	rain	water	wind	piano	sax	trumpet	clarinet	The banks and the	electronic	snare	shaker	fem num	fem vend		male free
Spectral Centroid Overal	0.223438	0.080271	0.703084	0.022512	0.032755	0.171141	0.516795	0	0.030651	0.484303	0.43835	0.320605	0.315963	1	0.538147	0.544182
MFCC Overall Standard	0.160603	0	0.12831	0.296671	0.026915	0.07114	0.932677	0.010681	0.042569	0.068595	1	0.056389	0.050478	0.262544	0.443084	0.408601
MFCC Overall Standard	0.454789	0	0.734831	0.333547	0.14885	0.662065	1	0.196041	0.184912	0.256608	0.346174	0.112895	0.981808	0.783093	0.858213	0.870305
MFCC Overall Standard	0.17897	0.038414	1	0.259161	0.161267	0.577093	0.344132	0	0.533369	0.368384	0.24854	0.125155	0.927598	0.869534	0.740131	0.848469
MFCC Overall Standard	0.071664	0	0.94277	0.451	0.431755	0.407192	0.327678	0.530767	0.246645	0.15219	0.29957	0.130413	0.71689	0.401367	0.76627	1
MFCC Overall Standard	0.085818	0	0.677507	0.279133	0.382114	0.310148	0.654923	0.715748	0.328214	0.147245	0.099067	0.016862	0.28636	0.511292	0.456489	0.858777
MFCC Overall Standard	0.087476	0	0.551791	0.06887	0.241322	0.611497	0.430991	1	0.227992	0.065815	0.040267	0.094974	0.265204	0.353791	0.304915	0.397667
MFCC Overall Standard	0.00562	0.006462	0.547626	0.026131	0.193313	0.953639	1	0.896881	0.246979	0.148356	0	0.001405	0.474852	0.238831	0.06603	0.233493
MFCC Overall Standard	0.072072	0.057373	0.363679	0.133001	0.218113	0.563537	1	0.174253	0.269085	0.102655	0	0.113561	0.215268	0.255571	0.423661	0.478189
MFCC Overall Standard	0.016933	0	0.293631	0.133923	0.271888	0.540119	1	0.559938	0.156052	0.08274	0.11295	0.014047	0.186069	0.078892	0.109871	0.20204
MFCC Overall Standard	0.0452	0	0.23062	0.060024	0.289429	1	0.798542	0.735115	0.142649	0.006804	0.094532	0.020413	0.200243	0.194411	0.142406	0.18226
MFCC Overall Standard	0.024386	0.017823	0.175348	0.089517	0.302917	0.78963	1	0.335734	0.049294	0.03785	0	0.04475	0.304263	0.115771	0.049799	0.175348
MFCC Overall Standard	0	0.000839	0.210107	0.041099	0.357937	0.793877	1	0.267771	0.082827	0.06731	0.054728	0.048228	0.377438	0.13399	0.047389	0.126022
MFCC Overall Standard	0.017466	0.012393	0.163677	0.036489	0.177084	1	0.396492	0.841649	0.093742	0	0.05044	0.02127	0.271298	0.18415	0.018009	0.043918
Spectral Centroid Overal	0.017418	0.623156	0.481451	0	0.118548	0.290953	0.522161	0.110094	0.01667	0.422499	0.221694	1	0.169936	0.295476	0.151768	0.157033
MFCC Overall Average	0.813846	0.981538	0.631795	0.755385	0.904615	0.861026	0.028205	1	0.858462	0.814359	0	0.730256	0.798462	0.718974	0.615897	0.793333
MFCC Overall Average	0.704461	0.275283	0.489398	0.972808	0.905652	0.247174	0	0.549649	1	0.335289	0.59363	0.274366	0.905591	0.780293	0.798564	0.880293
MFCC Overall Average	0.833489	0.171585	0.399899	0.097658	0.144653	0.225371	0.175956	0	0.015769	0.478689	0.544887	0.426854	0.690086	0.816315	1	0.935051
MFCC Overall Average	1	0.555483	0.776735	0.029875	0.531736	0.649759	0.231561	0.72715	0.445393	0.809915	0.17761	0.548041	0	0.73817	0.797658	0.78271
MFCC Overall Average	0.785927	0.637177	0.531043	0.350579	0.297599	0.45207	0.595828	0.489404	0.324586	0.59529	0.654031	0.62572	0	0.593121	0.699007	0.736424
MFCC Overall Average	0.952655	0.617231	0.654898	0.632983	0.497568	0.552655	0.804566	0.048635	0.536079	0.776079	0.789578	0.613132	1	0.886452	0.697261	0.673752
MFCC Overall Average	0.800068	0.597629	0.70794	0.697317	0.714736	1	0.732371	0	0.609214	0.703841	0.714011	0.692778	0.326016	0.699526	0.743286	0.676192
MFCC Overall Average	0.514256	0.467125	0.384191	0.398806	0.586331	0.896168	0.375471	0	0.429175	0.473731	0.456914	0.45543	0.608699	0.46448	0.45806	0.414249
MFCC Overall Average	0.584783	0.509525	0.613079	0.380682	0.742665	1	0.42314	0	0.697624	0.53095	0.302376	0.529339	0.213326	0.458171	0.393905	0.514318
MFCC Overall Average	0.614318	0.494363	0.707224	0.374863	0.264684	0.118935	0.653466	0.114739	0.805363	0.401496	0.301167	0.481193	1	0.834002	0.473477	0.53776
MFCC Overall Average	0.819686	0.773508	0.717941	0.847086	0.554444	0	0.736759	1	0.746566	0.742831	0.725186	0.787826	0.611083	0.651189	0.829278	0.741474
MFCC Overall Average	0.571063	0.533829	0.584832	0.759674	0.383849	0	0.317329	0.979811	0.540352	0.579863	0.74272	0.566856	0.550084	0.634205	0.460981	0.576899
MFCC Overall Average	0.593863	0.598801	0.558187	0.731064	0.557605	0.763954	0.634045	1	0.622671	0.61636	0.671475	0.545719	0.425536	0.60179	0.606719	0.593889

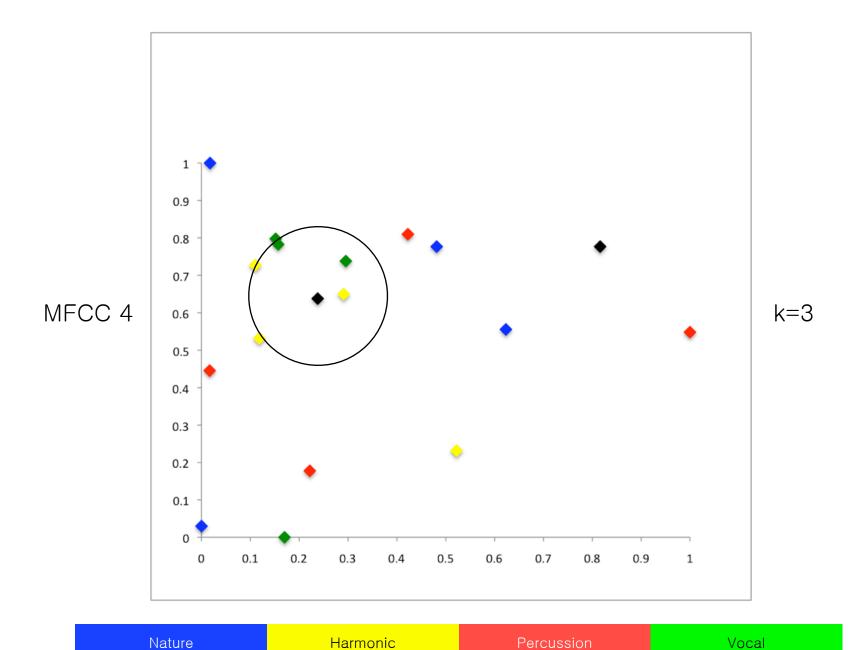


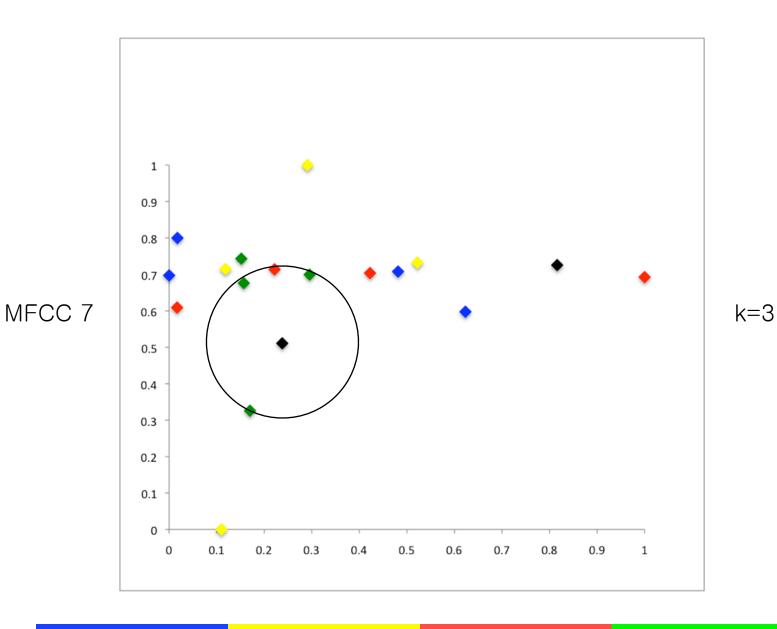
Percussion

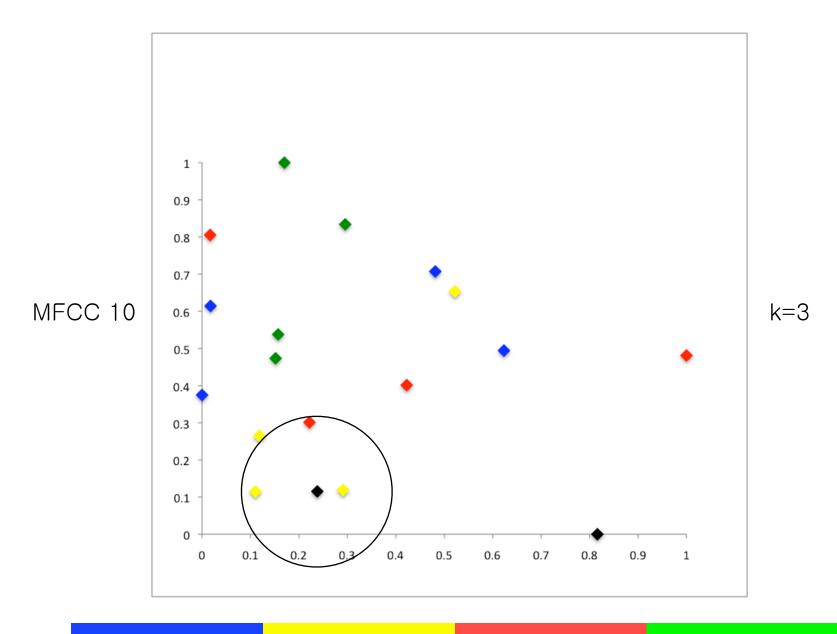
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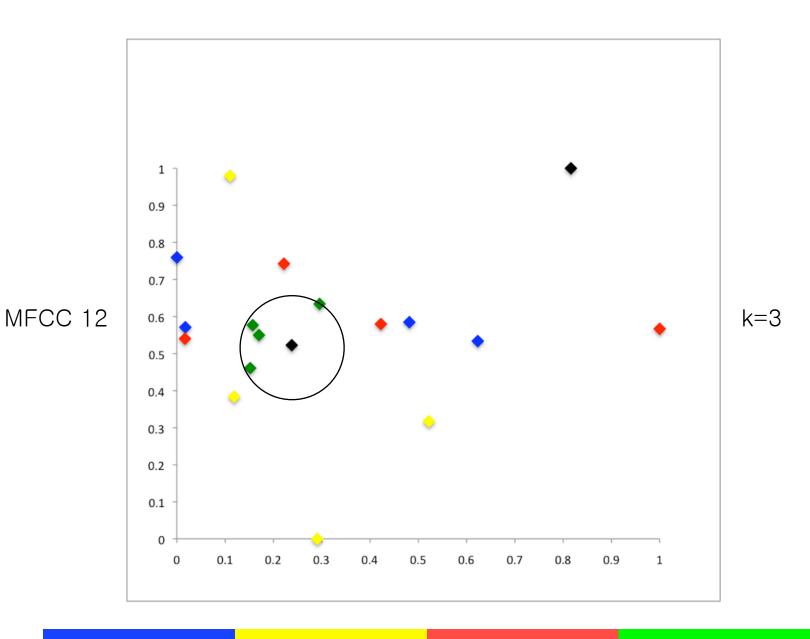












#### kNN Classification

	fire	rain	water	wind	piano	sax	trumpet	clarinet
k 3								
voice 13 MFCC	1.142746	0.894612	0.904429	0.964122	0.826126	1.50784	1.453826	1.091309
					2			

	djembe	electronic	snare	shaker	fem num	fem vend	male nice	male free
	1.06503	0.797576	1.153617	1.094187	1.452403	1.048918	0.92196	0.887217
•		1						3

#### kNN Classification

	fire	rain	water	wind	piano	sax	trumpet	clarinet
k 3								
voice 13 MFCC	1.142746	0.894612	0.904429	0.964122	0.826126	1.50784	1.453826	1.091309
					2			
voice 7 MFCC	0.645248	0.674863	0.605731	0.808231	0.632374	1.325041	1.250543	0.841709
	djembe	electronic	snare	shaker	fem num	fem vend	male nice	male free
	1.06503	0.797576	1.153617	1.094187	1.452403	1.048918	0.92196	0.887217
		1						3
	0.636224	0.583452	1.026869	0.965161	0.70116	0.36898	0.458311	0.420688
						1	3	2

### Summary

Conceptually simple solves complex problems

Work with relatively little information

No learning costs

Memory and CPU cost

Feature selection problem

Sensitive to representation

### Bibliography

http://www.music.mcgill.ca/~gabriel/courses/mumt621/presentations/3\_kNN/annotated\_bibliography.html

Cover, T. and P. Hart. 1967. Nearest neighbor pattern classification. *IEEE Transactions on Information Theory*. 13(1): 21-27.

Cui, B., Shen, J., Cong, G., Shen, H. T., and C. Yu. 2006. Exploring composite acoustic features for efficient music similarity query. In *Proceedings of the 14th Annual ACM international Conference on Multimedia* 

Fujinaga, I. 1996. Exemplar-based learning in adaptive optical music recognition system. *Proceedings of the International Computer Music Conference*. 55–6.

Jiansheng, W. 2009. A Novel Artificial Neural Network Ensemble Model Based on K--Nearest Neighbor Nonparametric Estimation of Regression Function and Its Application for Rainfall Forecasting. , *International Joint Conference on Computational Sciences and Optimization*. 2:44-8.

McKay, C., and I. Fujinaga. 2004. Automatic Genre Classification Using Large High-Level Musical Feature Sets. *Proceedings of the International Conference on Music Information Retrieval*. 525-30.

Moore, A. 1991. An introductory tutorial on kd-trees. Efficient Memory-based Learning for Robot Control. 6(1) 6(18).

Younes, Z., F. Aballah, and T. Denoeux. 2008. Multi-label classification algorithm derived from k-nearest neighbor rule with label dependencies. In *Proceedings of the 16th European Signal Processing Conference* 

Zhang, H., A. C. Berg, M. Maire, and J. Malik. 2006. SVM-kNN: Discriminative nearest neighbor classification for visual category recognition. In *CVPR*. 2:2126-36.

## Thanks!