Precision-Recall Analysis (norm-P-score)

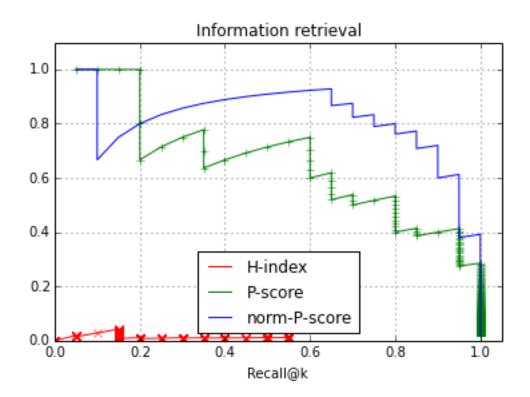
March 14, 2017

Created by Alberto Ueda on 2017-01-30

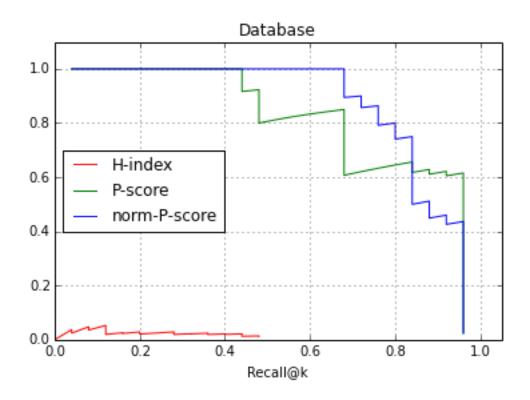
0.1 Methods

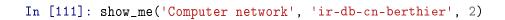
```
In [1]: %pylab inline
        import pandas as pd
        import numpy as np
        import matplotlib.pyplot as plt
Populating the interactive namespace from numpy and matplotlib
In [265]: def plot_prec_recall(df, name):
              axes = df.plot(label='H-index', x='Recall.0@k',y='Precision.0@k', style='r-', grid
              df.plot(label='P-score', x='Recall.10k', y='Precision.10k', style='g-', grid=3, ax
              df.plot(label='norm-P-score', x='Recall.20k', y='Precision.20k', style='b-', grid=
              axes.set_ylim(0, 1.1)
              axes.set_xlim(0, 1.05)
              axes.set_xlabel("Recall@k")
              axes.set_title(name)
In [108]: def compute_prec_recall(rankings, vsubareas, subarea, dirname):
             result = rankings.merge(
                  vsubareas, on='Vkey', how='left').merge(
                  vsubareas, left_on='Vkey.1', right_on='Vkey', how='left').merge(
                  vsubareas, left_on='Vkey.2', right_on='Vkey', how='left')
             result.rename(columns={'Rank':'Rank.0', 'Vkey_x':'Vkey.0', 'Subareas_x':'Subareas.
                                             'Subareas_y':'Subareas.1', 'Subareas':'Subareas.2'}
             totalrel = float(vsubareas['Subareas'].str.contains(subarea)].shape[0])
             for i in range(0, 3):
                  result[subarea + str(i)] = result['Subareas.'+ str(i)].apply(lambda x: subarea
```

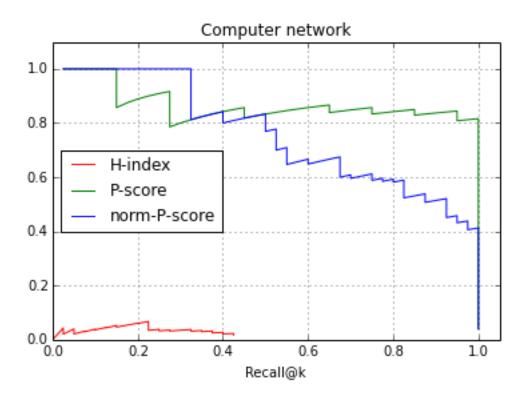
```
foundrel = 0
                  for index, row in result.iterrows():
                      if row[subarea + str(i)] == True:
                          foundrel += 1
                      result.loc[index, 'Precision.' + str(i) + '@k'] = foundrel / float(index+1
                      result.loc[index, 'Recall.' + str(i) + '@k'] = foundrel / totalrel
                  del result[subarea + str(i)]
              result = result[[
                      'Rank.O', 'Vkey.O', 'Subareas.O', 'Precision.O@k', 'Recall.O@k',
                      'Rank.1', 'Vkey.1', 'Subareas.1', 'Precision.1@k', 'Recall.1@k',
                      'Rank.2', 'Vkey.2', 'Subareas.2', 'Precision.20k', 'Recall.20k',
                  11
              result.to_csv('expert-subareas-classification/' + dirname + '/' + subarea + '_pred
              plot_prec_recall(result, subarea)
              return result
In [237]: def show_me(subarea, dirname, min_votes):
             vs = pd.read_csv('expert-subareas-classification/' + dirname + '/venues_subareas-'
              rankings = pd.read_csv('input/march-9-the-right-50/' + subarea + '.csv',
                                       usecols = ['Rank', 'Vkey', 'Rank.1', 'Vkey.1', 'Rank.2',
              compute_prec_recall(rankings, vs, subarea, dirname)
0.2 Plotting I
In [155]: show_me('Information retrieval', 'ir-db-cn-berthier', 2)
```



In [109]: show_me('Database', 'ir-db-cn-berthier', 2)

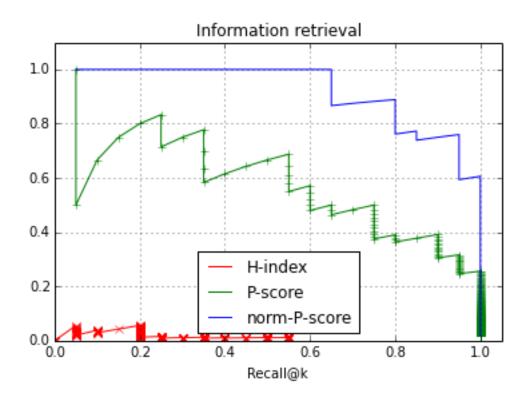




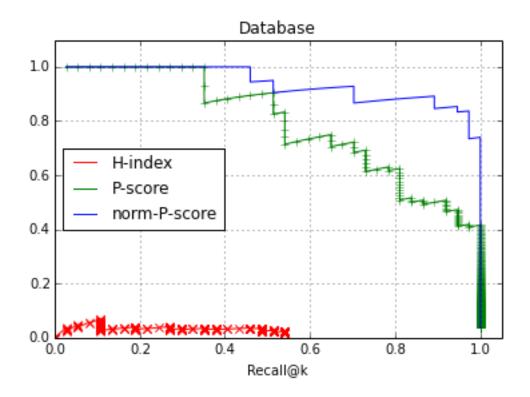


0.3 Plotting II

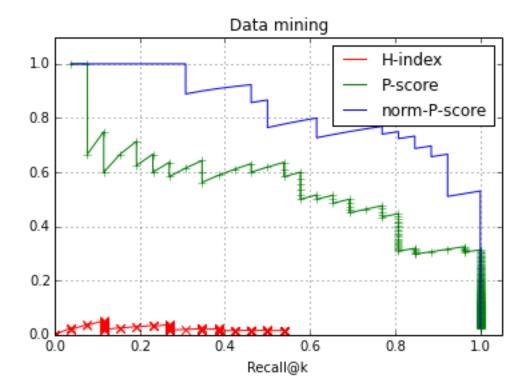
In [159]: show_me('Information retrieval', 'ir-students', 2)



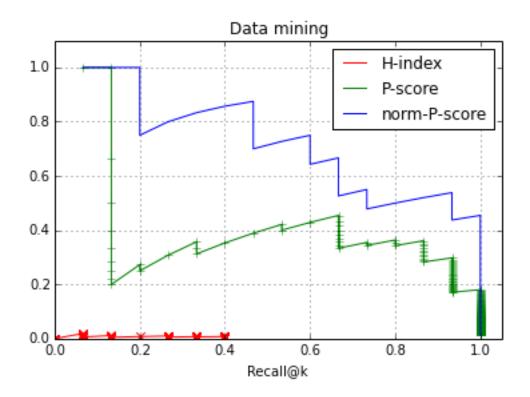
In [133]: show_me('Database', 'db', 1)



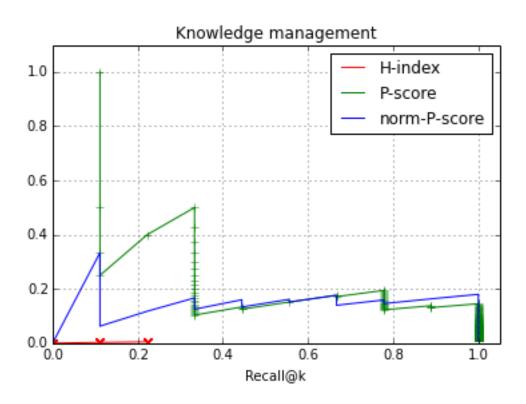
In [138]: show_me('Data mining', 'dm', 2)



In [141]: show_me('Data mining', 'dm', 3)



In [144]: show_me('Knowledge management', 'km', 2)



0.4 Plotting III

 ${\tt In~[149]:~pd.read_csv('expert-subareas-classification/ir-db-cn-berthier/Information~retrieval_properties of the contraction of the contractio$

Out[149]:		Unnamed: 0	Rank.0	Vkey.0	\
	0	omnamed. O	1	journals/nar	`
	1	1	2	conf/balt	
	2	2	3	journals/cce	
	3	3	4	conf/cvpr	
	4	4	5	journals/pr	
	5	5	6	journals/cee	
	6	6	7	journals/cma	
	7	7	8	journals/neuroimage	
	8	8	9	conf/mmar	
	9	9	10	conf/icete	
	10	10	11	journals/information	
	11	11	12	journals/eswa	
	12	12	13	journals/scl	
	13	13	14	journals/automatica	
	14	14	15	journals/cm	
	15	15	16	journals/pieee	
	16	16	17	journals/sigpro	
	17	17	18	conf/www	
	18	18	19	journals/www	
	19	19	20	journals/or	
	20	20	21	journals/ploscb	
:	21	21	22	conf/coordination	
:	22	22	23	conf/infocom	
:	23	23	24	journals/computer	
	24	24	25	journals/bmcbi	
	25	25	26	journals/ml	
:	26	26	27	journals/is	
	27	27	28	journals/isci	
:	28	28	29	conf/dasip	
	29	29	30	journals/bise	
	• •				
	970	970	971	conf/wia	
	971	971	972	conf/wollic	
	972	972	973	conf/secrypt	
	973	973	974	conf/camad	
	974	974	975	conf/fdl	
	975	975	976	conf/icaris	
	976	976	977	conf/adma	
	977	977	978	conf/cacsd	
!	978	978	979	conf/wmte	

			COMITY I GAGGED			
980	980	981	conf/rsfdgrc			
981	981	982	conf/ilp			
			=			
982	982	983	conf/ems			
983	983	984	conf/ic3			
984	984	985	conf/icinco			
985	985	986	conf/icsob			
986	986	987	conf/medes			
987	987	988	conf/mobilight			
988	988	989	journals/at			
989	989	990	conf/biosig			
990	990	991	conf/mig			
991	991	992	conf/epia			
			-			
992	992	993	conf/mbmv			
993	993	994	conf/csedu			
994	994	995	conf/isvd			
995	995	996	conf/wims			
996	996	997	conf/eurocast			
997	997	998	journals/cit			
			<u> </u>			
998	998	999	conf/asmta			
999	999	1000	journals/jca			
			Subareas.0	Precision.0@k	Recall.00k	\
0			NaN	0.00000	0.00	
1			NaN	0.000000	0.00	
2			NaN	0.000000	0.00	
3	[] Comput on					
3						
	[Combacer	vision',	'Pattern recognition']	0.000000	0.00	
4	[Comparer	Vision',	NaN	0.000000	0.00	
4 5	[Computer	vision',				
	[Computer	vision',	NaN	0.000000	0.00	
5 6	[Computer	vision',	NaN NaN NaN	0.000000 0.000000 0.000000	0.00 0.00 0.00	
5 6 7	[Computer	vision',	NaN NaN NaN	0.000000 0.000000 0.000000 0.000000	0.00 0.00 0.00 0.00	
5 6 7 8	Computer	vision',	NaN NaN NaN NaN	0.000000 0.000000 0.000000 0.000000	0.00 0.00 0.00 0.00 0.00	
5 6 7 8 9	Computer	vision',	NaN NaN NaN	0.000000 0.000000 0.000000 0.000000 0.000000	0.00 0.00 0.00 0.00 0.00	
5 6 7 8	[Computer	vision',	NaN NaN NaN NaN	0.000000 0.000000 0.000000 0.000000	0.00 0.00 0.00 0.00 0.00	
5 6 7 8 9	Computer	vision',	NaN NaN NaN NaN NaN	0.000000 0.000000 0.000000 0.000000 0.000000	0.00 0.00 0.00 0.00 0.00	
5 6 7 8 9 10 11	[Gomputer	vision',	NaN NaN NaN NaN NaN NaN	0.000000 0.000000 0.000000 0.000000 0.000000	0.00 0.00 0.00 0.00 0.00 0.00 0.00	
5 6 7 8 9 10 11	[Computer	vision',	NaN NaN NaN NaN NaN NaN NaN	0.000000 0.000000 0.000000 0.000000 0.000000	0.00 0.00 0.00 0.00 0.00 0.00 0.00	
5 6 7 8 9 10 11 12 13	[Computer	vision',	NaN NaN NaN NaN NaN NaN NaN	0.000000 0.000000 0.000000 0.000000 0.000000	0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.0	
5 6 7 8 9 10 11 12 13 14	[Computer	vision',	NaN NaN NaN NaN NaN NaN NaN NaN	0.000000 0.000000 0.000000 0.000000 0.000000	0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.0	
5 6 7 8 9 10 11 12 13 14 15	[Computer	vision',	NaN NaN NaN NaN NaN NaN NaN NaN NaN	0.000000 0.000000 0.000000 0.000000 0.000000 0.000000 0.000000 0.000000 0.000000	0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.0	
5 6 7 8 9 10 11 12 13 14	[Computer	vision',	NaN NaN NaN NaN NaN NaN NaN NaN	0.000000 0.000000 0.000000 0.000000 0.000000	0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.0	
5 6 7 8 9 10 11 12 13 14 15	[Computer	vision',	NaN NaN NaN NaN NaN NaN NaN NaN NaN	0.000000 0.000000 0.000000 0.000000 0.000000 0.000000 0.000000 0.000000 0.000000	0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.0	
5 6 7 8 9 10 11 12 13 14 15 16	[Computer	vision',	NaN NaN NaN NaN NaN NaN NaN NaN NaN NaN	0.000000 0.000000 0.000000 0.000000 0.000000	0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.0	
5 6 7 8 9 10 11 12 13 14 15 16 17 18	[Computer	vision',	NaN	0.000000 0.000000 0.000000 0.000000 0.000000	0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.0	
5 6 7 8 9 10 11 12 13 14 15 16 17 18	[Computer	vision',	NaN	0.000000 0.000000 0.000000 0.000000 0.000000	0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.0	
5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20	[Computer	vision',	NaN	0.000000 0.000000 0.000000 0.000000 0.000000	0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.0	
5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20 21	[Computer	vision',	NaN	0.000000 0.000000 0.000000 0.000000 0.000000	0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00	
5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20	[Computer	vision',	NaN	0.000000 0.000000 0.000000 0.000000 0.000000	0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.0	
5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20 21	[Computer	vision',	NaN	0.000000 0.000000 0.000000 0.000000 0.000000	0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00	
5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20 21 22	[Computer	vision',	NaN	0.000000 0.000000 0.000000 0.000000 0.000000	0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00	

conf/idaacs

0.5			NT - NT	0 000000	0.00
25 26		Г	NaN	0.000000	0.00
26 27			['Database']	0.000000	0.00
27		['Knowledge m	•	0.000000	0.00
28			NaN	0.000000	0.00
29			NaN	0.000000	0.00
970			 NaN	0.011329	0.55
971			nan NaN	0.011329	0.55
971			nan NaN	0.011317	0.55
973			nan NaN	0.011303	
					0.55
974			NaN NaN	0.011282	0.55
975 976			NaN NaN	0.011270	0.55
			nan NaN	0.011259	0.55
977 978			nan NaN	0.011247	0.55
979			nan NaN	0.011236	0.55 0.55
980			nan NaN	0.011224 0.011213	0.55
981			nan NaN	0.011213	0.55
982			nan NaN	0.011202	
983			nan NaN	0.011190	0.55 0.55
984			NaN	0.011179	0.55
985			NaN	0.011166	0.55
986			NaN	0.011145	0.55
987			NaN	0.011143	0.55
988			NaN	0.011122	0.55
989			NaN	0.011111	0.55
990			NaN	0.011111	0.55
991			NaN	0.011089	0.55
992			NaN	0.011078	0.55
993			NaN	0.011066	0.55
994			NaN	0.011055	0.55
995			NaN	0.011044	0.55
996			NaN	0.011033	0.55
997			NaN	0.011022	0.55
998			NaN	0.011011	0.55
999			NaN	0.011000	0.55
	Rank.1	Vkey.1	\		
0	1	conf/sigir			
1	2	conf/cikm			
2	3	conf/trec			
3	4	conf/ecir			
4	5	conf/clef			
5	6	conf/www			
6	7	journals/jasis			
7	8	journals/ipm			
8	9	journals/sigir			
9	10	conf/mm			

10	4.4	C / :
10	11	conf/aaai
11	12	conf/jcdl
12	13	journals/tois
13	14	journals/ir
14	15	conf/wsdm
15	16	conf/ntcir
16	17	conf/kdd
17	18	journals/tkde
18	19	conf/acl
19	20	conf/icdm
20	21	conf/spire
21	22	conf/icde
22	23	conf/ercimdl
23	24	conf/icmcs
24	25	conf/sigmod
25	26	conf/airs
26	27	conf/coling
27	28	conf/ijcai
28	29	conf/riao
29	30	conf/inex
23	50	coni, inex
970	971	conf/emc
971	972	journals/aes
972	973	-
		journals/iandc
973	974	conf/seal
974	975	journals/ijcgt
975	976	conf/vlsi
976	977	conf/itng
977	978	journals/cal
978	979	conf/iasam
979	980	conf/arc
980	981	conf/itc
981	982	conf/sysose
982	983	conf/sitis
983	984	journals/mam
984	985	conf/iswc
985	986	journals/biodatamining
986	987	journals/ijwmc
987	988	conf/cf
988	989	journals/cars
989	990	journals/jvis
990	991	conf/icgec
991	992	conf/arith
992	993	conf/dils
993	994	conf/concur
994	995	conf/debs
995	996	journals/esi
996	997	journals/ijcnds
550	551	journars, rjenus

```
997
        998
                        conf/bildmed
998
        999
                      journals/jicce
999
       1000
                             conf/sbp
                                               Subareas.1 Precision.10k
0
                               ['Information retrieval']
                                                                 1.000000
1
     ['Database', 'Information retrieval', 'Knowled...
                                                                 1.000000
2
                               ['Information retrieval']
                                                                 1.000000
3
                               ['Information retrieval']
                                                                 1.000000
4
                                                                 0.800000
5
                                      ['World Wide Web']
                                                                 0.666667
6
                               ['Information retrieval']
                                                                 0.714286
7
                               ['Information retrieval']
                                                                 0.750000
8
                               ['Information retrieval']
                                                                 0.777778
9
                                           ['Multimedia']
                                                                 0.700000
                             ['Artificial intelligence']
10
                                                                 0.636364
11
                               ['Information retrieval']
                                                                 0.666667
                               ['Information retrieval']
12
                                                                 0.692308
13
                               ['Information retrieval']
                                                                 0.714286
14
               ['Data mining', 'Information retrieval']
                                                                 0.733333
                               ['Information retrieval']
15
                                                                 0.750000
                ['Data mining', 'Knowledge management']
16
                                                                 0.705882
                   ['Database', 'Knowledge management']
17
                                                                 0.666667
18
     ['Machine learning', 'Natural language process...
                                                                 0.631579
19
                                          ['Data mining']
                                                                 0.600000
20
                               ['Information retrieval']
                                                                 0.619048
21
                                             ['Database']
                                                                 0.590909
                                                      ['']
22
                                                                 0.565217
23
                                           ['Multimedia']
                                                                 0.541667
24
                                             ['Database']
                                                                 0.520000
                               ['Information retrieval']
25
                                                                 0.538462
26
                         ['Natural language processing']
                                                                 0.518519
                             ['Artificial intelligence']
27
                                                                 0.500000
28
                               ['Information retrieval']
                                                                 0.517241
29
                               ['Information retrieval']
                                                                 0.533333
. .
                                                                       . . .
                                                                 0.020597
970
                                                      NaN
971
                                                      NaN
                                                                 0.020576
972
                                                      NaN
                                                                 0.020555
973
                                                      NaN
                                                                 0.020534
974
                                                      NaN
                                                                 0.020513
975
                                                      NaN
                                                                 0.020492
976
                                                      NaN
                                                                 0.020471
977
                                                      NaN
                                                                 0.020450
978
                                                      NaN
                                                                 0.020429
979
                                                      NaN
                                                                 0.020408
980
                                                      NaN
                                                                 0.020387
981
                                                      NaN
                                                                 0.020367
```

982 983 984 985 986 987 988 990 991 992 993 994 995 996 997 998					NaN	0.020346 0.020325 0.020305 0.020284 0.020263 0.020243 0.020222 0.020202 0.020161 0.020161 0.020141 0.020121 0.020101 0.020080 0.020080 0.020040 0.020020 0.020000
	Recall.10k	Rank.2	Vkey.2	\		
0	0.05	1	conf/ictir			
1	0.10	2	conf/sigir			
2	0.15	3	conf/adcs			
3	0.20	4	journals/ir			
4	0.20	5	conf/ecir			
5	0.20	6	conf/trec			
6	0.25	7	journals/sigir			
7	0.30	8	conf/iiix			
8	0.35	9	journals/tois			
9	0.35	10	conf/wsdm			
10	0.35	11	conf/inex			
11 12	0.40	12 13	conf/spire			
13	0.45 0.50	14	conf/airs conf/cikm			
14	0.55	15	journals/tweb			
15	0.60	16	conf/riao			
16	0.60	17	conf/clef			
17	0.60	18	conf/ntcir			
18	0.60	19	conf/la-web			
19	0.60	20	conf/jcdl			
20	0.65	21	journals/tist			
21	0.65	22	journals/ipm			
22	0.65	23	conf/ercimdl			
23	0.65	24	conf/www			
24	0.65	25	conf/mir			
25	0.70	26	conf/isi			
26	0.70	27	conf/icwsm			
27	0.70	28	conf/mmm			

```
28
            0.75
                       29
                                    conf/adc
29
            0.80
                       30
                                  conf/icadl
             . . .
970
            1.00
                      971
                                conf/icecsys
            1.00
                            conf/edutainment
971
                      972
            1.00
                      973
                                 conf/iwinac
972
973
            1.00
                      974
                                    conf/mue
974
            1.00
                      975
                                   conf/ecms
            1.00
                      976
                                    conf/pdc
975
            1.00
                      977
976
                                 conf/walcom
977
            1.00
                      978
                                   conf/wsks
            1.00
                      979
                                   conf/hpsr
978
            1.00
979
                      980
                                  conf/sisap
            1.00
                                 conf/profes
980
                      981
            1.00
981
                      982
                               conf/greencom
982
            1.00
                      983
                                   conf/vlsi
983
            1.00
                      984
                                   conf/mldm
984
            1.00
                      985
                                   conf/aime
            1.00
                            conf/iconference
985
                      986
986
            1.00
                      987
                                 conf/cyberc
                                  conf/ideal
987
            1.00
                      988
            1.00
988
                      989
                                  conf/ciarp
989
            1.00
                      990
                                  conf/jurix
990
            1.00
                      991
                                 conf/synasc
991
            1.00
                      992
                                  conf/icgec
            1.00
                      993
992
                                    conf/iti
993
            1.00
                      994
                                 conf/quatic
            1.00
994
                      995
                                   conf/3dtv
            1.00
                                   conf/snpd
995
                      996
996
            1.00
                      997
                                   conf/dgci
997
            1.00
                      998
                                journals/aml
998
            1.00
                      999
                                   conf/wwic
999
            1.00
                     1000
                                  conf/ispdc
                                                 Subareas.2
                                                              Precision.20k
0
                                ['Information retrieval']
                                                                    1.000000
1
                                ['Information retrieval']
                                                                   1.000000
2
                                                                   0.666667
3
                                ['Information retrieval']
                                                                   0.750000
4
                                ['Information retrieval']
                                                                   0.800000
5
                                ['Information retrieval']
                                                                   0.833333
6
                                ['Information retrieval']
                                                                   0.857143
7
      ['Human-computer interaction', 'Information re...
                                                                   0.875000
8
                                ['Information retrieval']
                                                                   0.888889
9
                ['Data mining',
                                 'Information retrieval']
                                                                   0.900000
10
                                ['Information retrieval']
                                                                   0.909091
11
                                ['Information retrieval']
                                                                   0.916667
12
                                ['Information retrieval']
                                                                   0.923077
```

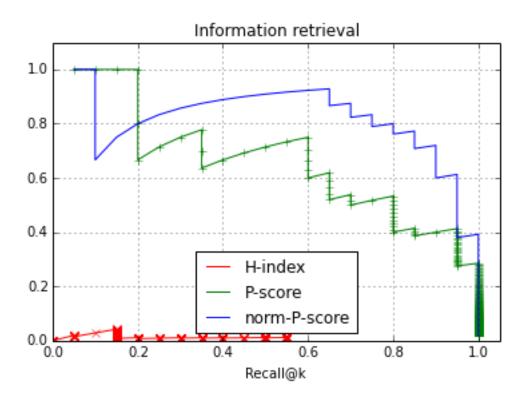
13	['Database', 'Information retrieval', 'Knowled	0.928571
14	NaN	0.866667
15	['Information retrieval']	0.875000
16	['']	0.823529
17	['Information retrieval']	0.833333
18	NaN	0.789474
19	['Information retrieval']	0.800000
20	NaN	0.761905
21	['Information retrieval']	0.772727
22	['']	0.739130
23	['World Wide Web']	0.708333
24	['Information retrieval', 'Multimedia']	0.720000
25	['Internet privacy']	0.692308
26	['World Wide Web']	0.666667
27	['Multimedia']	0.642857
28	NaN	0.620690
29	NaN	0.600000
	• • •	
970	NaN	0.020597
971	NaN	0.020576
972	NaN	0.020555
973	NaN	0.020534
974	NaN	0.020513
975	NaN	0.020492
976	NaN	0.020471
977	NaN	0.020450
978	NaN	0.020429
979	NaN	0.020408
980	NaN	0.020387
981	NaN	0.020367
982	NaN	0.020346
983	NaN	0.020325
984	NaN	0.020305
985	NaN	0.020284
986	NaN	0.020263
987	NaN	0.020243
988	NaN	0.020222
989	NaN	0.020202
990	NaN	0.020182
991	NaN	0.020161
992	NaN	0.020141
993	NaN	0.020121
994	NaN	0.020101
995	NaN	0.020080
996	NaN	0.020060
997	NaN	0.020040
998	NaN	0.020020
999	NaN	0.020000

	Recall.20k
0	0.05
1	0.10
2	0.10
3	0.15
4	0.20
5	0.25
6	0.30
7	0.35
8	0.40
9	0.45
10	0.50
11	0.55
12	0.60
13	0.65
14	0.65
15	0.70
16	0.70
17	0.75
18	0.75
19	0.80
20	0.80
21	0.85
22	0.85
23	0.85
24	0.90
25	0.90
26	0.90
27	0.90
28	0.90
29	0.90
 970	1.00
971	1.00
972	1.00
973	1.00
974	1.00
975	1.00
976	1.00
977	1.00
978	1.00
979	1.00
980	1.00
981	1.00
982	1.00
983	1.00
984	1.00

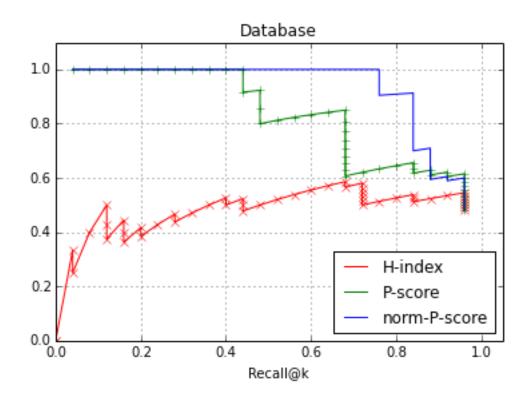
```
985
            1.00
986
            1.00
987
            1.00
988
            1.00
            1.00
989
            1.00
990
            1.00
991
            1.00
992
993
            1.00
994
            1.00
            1.00
995
996
            1.00
997
            1.00
            1.00
998
999
            1.00
```

[1000 rows x 16 columns]

In [162]: show_me('Information retrieval', 'ir-db-cn-berthier', 2)



In [171]: show_me('Database', 'ir-db-cn-berthier', 2)



In [169]: # TODO A few differences between the ones sent and the ones we get here
pd.read_csv('expert-subareas-classification/ir-db-cn-berthier/Information retrieval_pr

Out[169]:		Unnamed: 0	Rank.0	Vkey.0
	0	0	1	conf/cvpr
	1	1	2	conf/www
	2	2	3	conf/icml
	3	3	4	conf/nips
	4	4	5	conf/sigmod
	5	5	6	conf/wsdm
	6	6	7	conf/emnlp
	7	7	8	conf/icde
	8	8	9	conf/sigir
	9	9	10	journals/ir
	10	10	11	conf/icwsm
	11	11	12	conf/naacl
	12	12	13	conf/ijcai
	13	13	14	conf/aaai
	14	14	15	conf/sdm
	15	15	16	conf/vldb
	16	16	17	conf/coling
	17	17	18	conf/lrec
	18	18	19	conf/clef

```
19
19
                      20
                              conf/icmcs
20
             20
                      21
                               conf/webi
                                conf/jcdl
21
             21
                      22
22
             22
                      23
                              conf/spire
                                conf/trec
23
             23
                      24
24
             24
                      25
                                conf/mmm
25
             25
                      26
                                conf/inex
                            journals/ipm
26
             26
                      27
27
             27
                      28
                          journals/sigir
                                conf/airs
28
             28
                      29
29
             29
                                conf/chi
                      30
30
             30
                      31
                                conf/cikm
             31
                      32
                               conf/ecir
31
                      33
32
             32
                          journals/jasis
             33
                                  conf/mm
33
                      34
34
             34
                      35
                           journals/tois
35
             35
                      36
                              conf/ntcir
36
             36
                      37
                                conf/kdd
37
             37
                      38
                           journals/tkde
38
             38
                      39
                                conf/acl
                                conf/icdm
39
             39
                      40
             40
                      41
                            conf/ercimdl
40
41
             41
                      42
                               conf/riao
42
             42
                      43
                                conf/isi
43
             43
                      44
                           journals/cacm
44
             44
                      45
                          journals/pvldb
                                conf/iiix
45
             45
                      46
                              conf/ictir
46
             46
                      47
                                 conf/mir
47
             47
                      48
48
             48
                      49
                            journals/tmm
49
             49
                      50
                                conf/dgo
                                                           Precision.00k
                                               Subareas.0
0
            ['Computer vision', 'Pattern recognition']
                                                                 0.000000
1
                                      ['World Wide Web']
                                                                 0.000000
2
                                    ['Machine learning']
                                                                 0.000000
3
                                    ['Machine learning']
                                                                 0.000000
4
                                             ['Database']
                                                                 0.000000
5
              ['Data mining', 'Information retrieval']
                                                                 0.166667
6
                        ['Natural language processing']
                                                                 0.142857
7
                                             ['Database']
                                                                 0.125000
8
                               ['Information retrieval']
                                                                 0.22222
9
                               ['Information retrieval']
                                                                 0.300000
10
                                      ['World Wide Web']
                                                                 0.272727
                        ['Natural language processing']
11
                                                                 0.250000
                             ['Artificial intelligence']
12
                                                                 0.230769
13
                            ['Artificial intelligence']
                                                                 0.214286
14
                                          ['Data mining']
                                                                 0.200000
```

```
['Natural language processing']
16
                                                                0.176471
                       ['Natural language processing']
17
                                                                0.166667
18
                                                                0.157895
                                          ['Multimedia']
19
                                                                0.150000
20
                                     ['World Wide Web']
                                                                0.142857
21
                              ['Information retrieval']
                                                                0.181818
                              ['Information retrieval']
22
                                                                0.217391
23
                              ['Information retrieval']
                                                                0.250000
                                          ['Multimedia']
24
                                                                0.240000
25
                              ['Information retrieval']
                                                                0.269231
26
                              ['Information retrieval']
                                                                0.296296
27
                              ['Information retrieval']
                                                                0.321429
28
                              ['Information retrieval']
                                                                0.344828
                         ['Human-computer interaction']
29
                                                                0.333333
30
    ['Database', 'Information retrieval', 'Knowled...
                                                                0.354839
31
                              ['Information retrieval']
                                                                0.375000
32
                              ['Information retrieval']
                                                                0.393939
33
                                          ['Multimedia']
                                                                0.382353
34
                              ['Information retrieval']
                                                                0.400000
                              ['Information retrieval']
35
                                                                0.416667
               ['Data mining', 'Knowledge management']
36
                                                                0.405405
                  ['Database', 'Knowledge management']
37
                                                                0.394737
    ['Machine learning', 'Natural language process...
38
                                                                0.384615
39
                                         ['Data mining']
                                                                0.375000
40
                                                                0.365854
41
                              ['Information retrieval']
                                                                0.380952
42
                                   ['Internet privacy']
                                                                0.372093
43
                                           ['Algorithm']
                                                                0.363636
44
                                            ['Database']
                                                                0.355556
45
    ['Human-computer interaction', 'Information re...
                                                                0.369565
                              ['Information retrieval']
46
                                                                0.382979
47
               ['Information retrieval', 'Multimedia']
                                                                0.395833
                                          ['Multimedia']
48
                                                                0.387755
49
                                           ['Algorithm']
                                                                0.380000
    Recall.00k
                 Rank.1
                                  Vkey.1
0
          0.00
                      1
                              conf/sigir
1
          0.00
                      2
                               conf/cikm
2
          0.00
                      3
                               conf/trec
3
          0.00
                      4
                               conf/ecir
4
                      5
          0.00
                               conf/clef
5
          0.05
                      6
                                conf/www
6
                         journals/jasis
          0.05
7
                      8
                           journals/ipm
          0.05
8
          0.10
                      9
                         journals/sigir
9
          0.15
                     10
                                 conf/mm
10
          0.15
                     11
                               conf/aaai
```

['Database']

0.187500

15

```
11
           0.15
                      12
                                conf/jcdl
12
           0.15
                            journals/tois
                      13
13
           0.15
                      14
                              journals/ir
           0.15
                                conf/wsdm
14
                      15
                               conf/ntcir
15
           0.15
                      16
           0.15
                      17
                                 conf/kdd
16
17
           0.15
                      18
                            journals/tkde
18
           0.15
                      19
                                 conf/acl
           0.15
                      20
                                conf/icdm
19
20
           0.15
                      21
                               conf/spire
21
           0.20
                      22
                                conf/icde
22
           0.25
                      23
                             conf/ercimdl
23
           0.30
                      24
                               conf/icmcs
24
           0.30
                      25
                              conf/sigmod
25
           0.35
                      26
                                conf/airs
26
           0.40
                      27
                              conf/coling
27
           0.45
                      28
                               conf/ijcai
28
           0.50
                      29
                                conf/riao
29
           0.50
                      30
                                conf/inex
30
           0.55
                      31
                                conf/icml
31
           0.60
                      32
                                conf/nips
32
                      33
                                conf/vldb
           0.65
33
           0.65
                      34
                                 conf/mmm
34
           0.70
                      35
                                 conf/isi
35
           0.75
                      36
                                conf/webi
                               conf/naacl
36
           0.75
                      37
                      38
37
           0.75
                            journals/cacm
38
           0.75
                      39
                                 conf/chi
           0.75
                      40
                           journals/pvldb
39
40
           0.75
                      41
                                conf/iiix
41
           0.80
                      42
                                conf/cvpr
                               conf/emnlp
42
           0.80
                      43
                                 conf/sdm
43
           0.80
                      44
44
           0.80
                               conf/ictir
                      45
                                 conf/mir
45
           0.85
                      46
46
           0.90
                      47
                             journals/tmm
                               conf/icwsm
47
           0.95
                      48
48
           0.95
                      49
                                 conf/dgo
49
           0.95
                      50
                                conf/lrec
                                                Subareas.1
                                                            Precision.10k
0
                               ['Information retrieval']
                                                                  1.000000
1
    ['Database', 'Information retrieval', 'Knowled...
                                                                  1.000000
2
                               ['Information retrieval']
                                                                  1.000000
3
                               ['Information retrieval']
                                                                  1.000000
4
                                                      ['']
                                                                  0.800000
5
                                       ['World Wide Web']
                                                                  0.666667
6
                               ['Information retrieval']
                                                                  0.714286
```

```
7
                              ['Information retrieval']
                                                                0.750000
8
                              ['Information retrieval']
                                                                0.777778
9
                                          ['Multimedia']
                                                                0.700000
10
                            ['Artificial intelligence']
                                                                0.636364
                              ['Information retrieval']
11
                                                                0.666667
12
                              ['Information retrieval']
                                                                0.692308
13
                              ['Information retrieval']
                                                                0.714286
              ['Data mining', 'Information retrieval']
14
                                                                0.733333
                              ['Information retrieval']
15
                                                                0.750000
               ['Data mining', 'Knowledge management']
16
                                                                0.705882
                  ['Database', 'Knowledge management']
17
                                                                0.666667
    ['Machine learning', 'Natural language process...
18
                                                                0.631579
                                         ['Data mining']
19
                                                                0.600000
20
                              ['Information retrieval']
                                                                0.619048
                                            ['Database']
21
                                                                0.590909
                                                    [ 1 ] 
22
                                                                0.565217
23
                                          ['Multimedia']
                                                                0.541667
24
                                            ['Database']
                                                                0.520000
25
                              ['Information retrieval']
                                                                0.538462
26
                       ['Natural language processing']
                                                                0.518519
                            ['Artificial intelligence']
27
                                                                0.500000
                              ['Information retrieval']
28
                                                                0.517241
                              ['Information retrieval']
29
                                                                0.533333
                                   ['Machine learning']
30
                                                                0.516129
31
                                   ['Machine learning']
                                                                0.500000
32
                                            ['Database']
                                                                0.484848
33
                                          ['Multimedia']
                                                                0.470588
                                   ['Internet privacy']
34
                                                                0.457143
35
                                     ['World Wide Web']
                                                                0.444444
36
                       ['Natural language processing']
                                                                0.432432
37
                                           ['Algorithm']
                                                                0.421053
38
                         ['Human-computer interaction']
                                                                0.410256
                                            ['Database']
39
                                                                0.400000
40
    ['Human-computer interaction', 'Information re...
                                                                0.414634
            ['Computer vision', 'Pattern recognition']
41
                                                                0.404762
42
                       ['Natural language processing']
                                                                0.395349
                                         ['Data mining']
43
                                                                0.386364
44
                              ['Information retrieval']
                                                                0.400000
45
               ['Information retrieval', 'Multimedia']
                                                                0.413043
                                          ['Multimedia']
46
                                                                0.404255
47
                                     ['World Wide Web']
                                                                0.395833
48
                                           ['Algorithm']
                                                                0.387755
49
                       ['Natural language processing']
                                                                0.380000
    Recall.10k Rank.2
                                  Vkey.2
0
          0.05
                              conf/ictir
1
          0.10
                      2
                             conf/sigir
2
          0.15
                      3
                            journals/ir
```

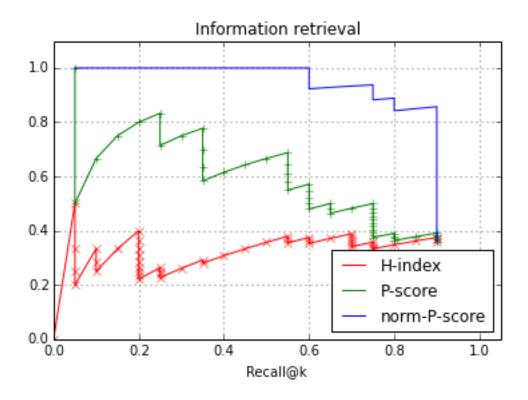
3	0.20	4	conf/ecir
4	0.20	5	conf/trec
5	0.20	6	journals/sigir
6	0.25	7	conf/iiix
7	0.30	8	journals/tois
8	0.35	9	conf/wsdm
9	0.35	10	conf/inex
10	0.35	11	conf/spire
11	0.40	12	conf/airs
12	0.45	13	conf/cikm
13	0.50	14	conf/riao
14	0.55	15	conf/clef
15	0.60	16	conf/ntcir
16	0.60	17	conf/jcdl
17	0.60	18	journals/ipm
18	0.60	19	conf/ercimdl
19	0.60	20	conf/www
20	0.65	21	conf/mir
21	0.65	22	conf/isi
22	0.65	23	conf/icwsm
23	0.65	24	conf/mmm
24	0.65	25	journals/jasis
25	0.70	26	conf/sdm
26	0.70	27	conf/mm
27	0.70	28	conf/kdd
28	0.75	29	journals/tkde
29	0.80	30	conf/naacl
30	0.80	31	journals/pvldb
31	0.80	32	conf/dgo
32	0.80	33	conf/emnlp
33	0.80	34	conf/icdm
34	0.80	35	conf/webi
35	0.80	36	conf/acl
36	0.80	37	journals/tmm
37	0.80	38	conf/icde
38	0.80	39	conf/vldb
39	0.80	40	conf/icml
40	0.85	41	conf/sigmod
41	0.85	42	conf/coling
42	0.85	43	conf/aaai
43	0.85	44	conf/ijcai
44	0.90	45	conf/icmcs
45	0.95	46	conf/nips
46	0.95	47	conf/lrec
47	0.95	48	conf/cvpr
48	0.95	49	journals/cacm
49	0.95	50	conf/chi

```
Subareas.2 Precision.20k
0
                              ['Information retrieval']
                                                                1.000000
1
                              ['Information retrieval']
                                                                1.000000
2
                              ['Information retrieval']
                                                                1.000000
3
                              ['Information retrieval']
                                                                1.000000
4
                              ['Information retrieval']
                                                                1.000000
5
                              ['Information retrieval']
                                                                1.000000
6
    ['Human-computer interaction', 'Information re...
                                                                1.000000
7
                              ['Information retrieval']
                                                                1.000000
              ['Data mining', 'Information retrieval']
8
                                                                1.000000
9
                              ['Information retrieval']
                                                                1.000000
10
                              ['Information retrieval']
                                                                1.000000
                              ['Information retrieval']
                                                                1.000000
11
12
    ['Database', 'Information retrieval', 'Knowled...
                                                                1.000000
                              ['Information retrieval']
13
                                                                1.000000
                                                     [ \cdot \cdot \cdot ]
14
                                                                0.933333
15
                              ['Information retrieval']
                                                                0.937500
16
                              ['Information retrieval']
                                                                0.941176
17
                              ['Information retrieval']
                                                                0.944444
18
                                                     ['']
                                                                0.894737
19
                                      ['World Wide Web']
                                                                0.850000
20
               ['Information retrieval', 'Multimedia']
                                                                0.857143
21
                                   ['Internet privacy']
                                                                0.818182
                                      ['World Wide Web']
22
                                                                0.782609
23
                                          ['Multimedia']
                                                                0.750000
                              ['Information retrieval']
24
                                                                0.760000
25
                                         ['Data mining']
                                                                0.730769
26
                                          ['Multimedia']
                                                                0.703704
27
               ['Data mining', 'Knowledge management']
                                                                0.678571
28
                  ['Database', 'Knowledge management']
                                                                0.655172
29
                        ['Natural language processing']
                                                                0.633333
30
                                            ['Database']
                                                                0.612903
31
                                           ['Algorithm']
                                                                0.593750
32
                        ['Natural language processing']
                                                                0.575758
33
                                         ['Data mining']
                                                                0.558824
                                      ['World Wide Web']
34
                                                                0.542857
    ['Machine learning', 'Natural language process...
35
                                                                0.527778
36
                                          ['Multimedia']
                                                                0.513514
37
                                            ['Database']
                                                                0.500000
                                            ['Database']
38
                                                                0.487179
39
                                   ['Machine learning']
                                                                0.475000
40
                                            ['Database']
                                                                0.463415
41
                        ['Natural language processing']
                                                                0.452381
                            ['Artificial intelligence']
42
                                                                0.441860
                            ['Artificial intelligence']
43
                                                                0.431818
44
                                          ['Multimedia']
                                                                0.422222
45
                                   ['Machine learning']
                                                                0.413043
46
                        ['Natural language processing']
                                                                0.404255
```

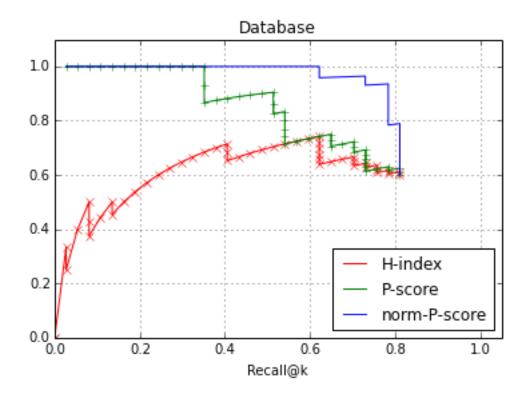
```
['Computer vision', 'Pattern recognition']
47
                                                                 0.395833
                                           ['Algorithm']
48
                                                                 0.387755
49
                         ['Human-computer interaction']
                                                                 0.380000
    Recall.20k
0
           0.05
1
           0.10
2
           0.15
3
           0.20
4
           0.25
5
           0.30
6
           0.35
7
           0.40
8
           0.45
9
           0.50
10
           0.55
11
           0.60
12
           0.65
13
           0.70
           0.70
14
15
           0.75
           0.80
16
17
           0.85
18
           0.85
19
           0.85
20
           0.90
21
           0.90
22
           0.90
23
           0.90
24
           0.95
25
           0.95
26
           0.95
27
           0.95
28
           0.95
29
           0.95
30
           0.95
31
           0.95
32
           0.95
33
           0.95
34
           0.95
35
           0.95
36
           0.95
37
           0.95
38
           0.95
39
           0.95
40
           0.95
41
           0.95
42
           0.95
```

```
43 0.95
44 0.95
45 0.95
46 0.95
47 0.95
48 0.95
49 0.95
```

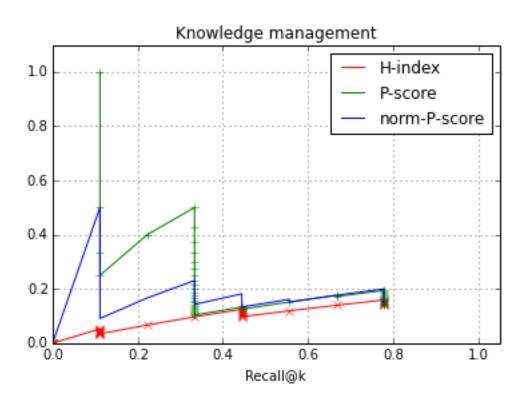
In [173]: show_me('Information retrieval', 'ir-students', 2)



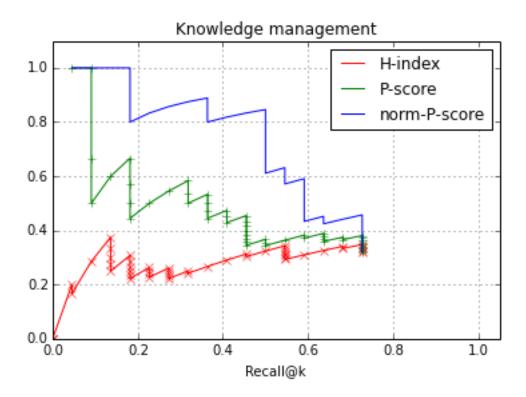
In [174]: show_me('Database', 'db', 1)



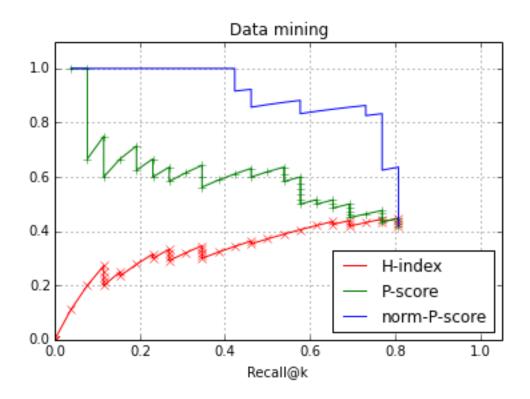
In [177]: show_me('Knowledge management', 'km', 2)



In [180]: show_me('Knowledge management', 'km', 1)



In [179]: show_me('Data mining', 'dm', 2)



0.5 Listing the differences

```
In [235]: def list_diff(dirname, subarea, min_votes):
              sent = pd.read_csv('expert-subareas-classification/' + dirname + '/venues_subareas
              rank = pd.DataFrame(pd.read_csv('input/march-7-50-venues/' + subarea + '.csv')['Vk
              m = sent.merge(rank, left_on='Vkey', right_on='Vkey.2', how='outer')
              m = m.rename(columns={'Vkey': 'Sent', 'Vkey.2': 'Ranked'})
              m = m[m.isnull().any(axis=1)]
             m = m.reset_index(drop=True)
             m.to_csv('expert-subareas-classification/differences/diff-' + dirname + '.csv')
              return m
          ir = list_diff('ir-students', 'Information retrieval', 2)
          db = list_diff('db', 'Database', 1)
          dm = list_diff('dm', 'Data mining', 2)
          km = list_diff('km', 'Knowledge management', 2)
In [236]: dm
Out[236]:
                       Sent
                                                                       Subareas \
                                                   ['Artificial intelligence']
              journals/tist
```

```
2
           conf/ssd
                                                                      ['Database']
                                                   ['Artificial intelligence']
3
           conf/ilp
4
      conf/aistats
                        ['Artificial intelligence', 'Data mining', 'Ma...
5
                                          ['Data science', 'World Wide Web']
        conf/icwsm
6
                                                   ['Data mining', 'Database']
        conf/dawak
7
     journals/tois
                                                                 ['Data science']
                       ['Artificial intelligence', 'Data mining', 'Ma...
8
      journals/ida
9
     journals/jiis
                        ['Artificial intelligence', 'Knowledge managem...
10
      journals/mms
                                               ['Data science', 'Multimedia']
     journals/tods
                                                                      ['Database']
11
12
           conf/mdm
                                   ['Data science', 'Knowledge management']
13
        conf/emnlp
                                              ['Natural language processing']
14
                                                  ['Data science', 'Database']
           conf/gis
          conf/waim
                        ['Data mining', 'Information retrieval', 'Know...
15
                                                                                ['']
16
                 NaN
17
                 NaN
                                                                                {\tt NaN}
                 NaN
18
                                                                                {\tt NaN}
19
                 NaN
                                                                                {\tt NaN}
20
                 NaN
                                                                                NaN
                 NaN
21
                                                                                {\tt NaN}
22
                 NaN
                                                                                {\tt NaN}
                 NaN
23
                                                                                NaN
24
                 NaN
                                                                                NaN
25
                 NaN
                                                                                NaN
                 {\tt NaN}
26
                                                                                NaN
27
                 NaN
                                                                                {\tt NaN}
28
                 NaN
                                                                                {\tt NaN}
29
                 NaN
                                                                                {\tt NaN}
30
                 NaN
                                                                                {\tt NaN}
31
                 NaN
                                                                                NaN
32
                 NaN
                                                                                {\tt NaN}
                          Ranked
0
                             {\tt NaN}
1
                             {\tt NaN}
2
                             {\tt NaN}
3
                             NaN
4
                             {\tt NaN}
5
                             {\tt NaN}
6
                             {\tt NaN}
7
                             {\tt NaN}
8
                             {\tt NaN}
9
                             {\tt NaN}
10
                             {\tt NaN}
11
                             {\tt NaN}
12
                             {\tt NaN}
13
                             {\tt NaN}
```

1

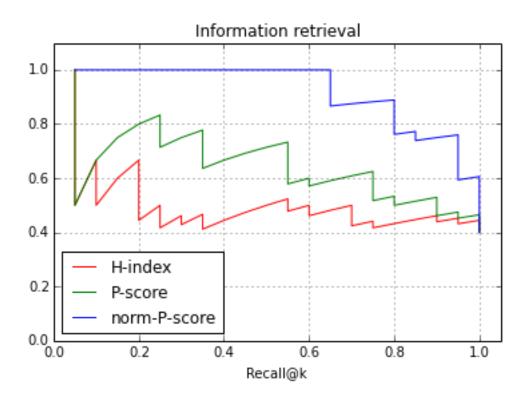
journals/sadm

['Data mining', 'Data science']

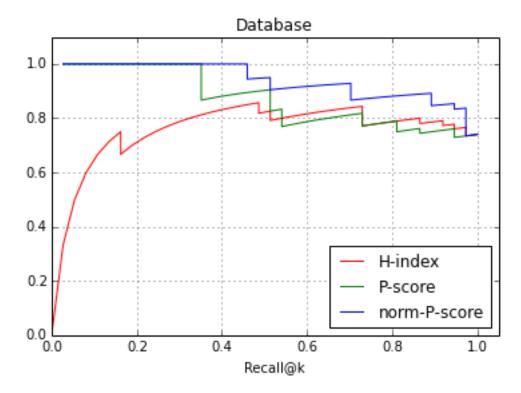
```
14
                           {\tt NaN}
15
                           {\tt NaN}
16
                           {\tt NaN}
17
                    conf/webi
                   conf/ijcai
18
                      conf/mm
19
                   conf/icmcs
20
                 journals/tnn
21
22
                     conf/acl
                     conf/sac
23
24
                    conf/cvpr
                journals/ijon
25
26
                journals/isci
              journals/bmcbi
27
28
                    conf/ipps
    journals/bioinformatics
29
30
                  journals/pr
31
                  conf/igarss
                    conf/icip
32
```

0.6 Plotting IV

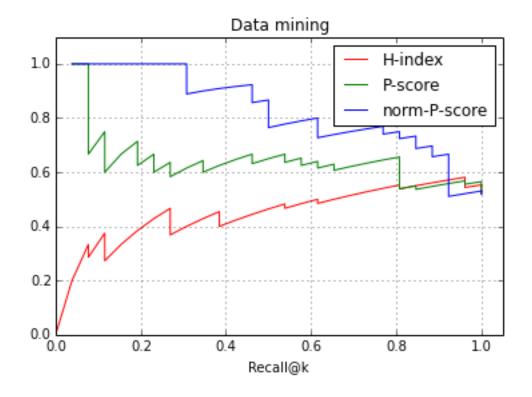
In [266]: show_me('Information retrieval', 'ir-students', 2)



In [267]: show_me('Database', 'db', 1)



In [268]: show_me('Data mining', 'dm', 2)



In [269]: show_me('Knowledge management', 'km', 2)

