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1 #!/usr/bin/env python3
2 # vim: ts=2 sw=2 sts=2 et :
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13 #
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15 #
16 ###
17 ./sublime.py [OPTIONS]
18 (c)2022 Tim Menzies <timm@ieee.org>
19 S.U.B.L.I.M.E. =
20 Sublime's unsupervised bifurcation: let's infer minimal explanations.
21
22 OPTIONS:
23
24 -Max      max numbers to keep      : 512
25 -Some     find 'far' in this many egs : 512
26 -cautious On any crash, stop+show stack : False
27 -data     data file                  : data/auto93.csv
28 -enough   min leaf size              : .5
29 -help     show help                  : False
30 -far      how far to look in 'Some'   : .9
31 -p        distance coefficient        : 2
32 -seed     random number seed         : 10019
33 -todo     start up task               : nothing
34 -xsmall   Cohen's small effect        : .35
35
36 ## See Also
37
38 [issues](https://github.com/timm/sublime/issues)
39 :: [repo](https://github.com/timm/sublime)
40 :: [view source](https://github.com/timm/sublime/blob/main/docs/pdf)
41
42 <a href=https://github.com/timm/sublime/actions/workflows/main.yml><img
43 src=https://github.com/timm/sublime/actions/workflows/main.yml/badge.svg></a>
44 
45 
46 
47 ](https://doi.org/10.5281/zenodo.5912461)
48 ## Algorithm
49
50 Stochastic clustering to generate tiny models. Uses random projections
51 to divide the space. Then, optionally, explain the clusters by
52 unsupervised iterative dichotomization using ranges that most
53 distinguish sibling clusters.
54
55 ### Example1: just bi-cluster on two distant points
56 ...
57
58 ./sublime.py -c -s $RANDOM -t cluster
59
60 .. : 398
61 .. : 199
62 .. : 99
63 .. : 49 Lbs- Acc+ Mpg+
64 .. : 24 : [2255, 15.5, 30]
65 .. : 25 : [2575, 16.4, 30]
66 .. : 50
67 .. : 25 : [2110, 16.4, 30] <== best
68 .. : 25 : [2205, 16, 30]
69 .. : 100
70 .. : 50
71 .. : 25 : [2234, 15.5, 30]
72 .. : 25 : [2278, 16.5, 30]
73 .. : 50
74 .. : 25 : [2220, 15.5, 30]
75 .. : 25 : [2320, 15.8, 30]
76 .. : 199
77 .. : 99
78 .. : 49
79 .. : 24 : [2451, 16.5, 20]
80 .. : 25 : [3021, 15.5, 20]
81 .. : 50
82 .. : 25 : [3425, 17.6, 20]
83 .. : 25 : [3155, 16.7, 20]
84 .. : 100
85 .. : 50
86 .. : 25 : [4141, 13.5, 10]
87 .. : 25 : [4054, 13.2, 20]
88 .. : 50
89 .. : 25 : [4425, 11, 10]
90 .. : 25 : [4129, 13, 10]
91
92 ### Example2: as above but split on range that most divides data
93 ...
94
95 ./sublime.py -c -s $RANDOM -t xplain
96
97 .. Lbs- Acc+ Mgg+
98 .. : 398 : [2807, 15.5, 20]
99 198 <= Lbs < 454 : 167 : [3725, 14.5, 20]
100 .. Modl < 72 : 34 : [3609, 13, 20]
101 .. Modl >= 72 : 133 : [3735, 14.9, 20]
102 .. Cylr < 8 : 56 : [3336, 17, 20]
103 .. : 77 <= Modl < 82 : 22 : [3410, 17.1, 20]
104 .. Modl < 77 or Modl >= 82 : 34 : [3233, 17, 20]
105 .. Cylr >= 8 : 77 : [4129, 13.2, 20]
106 .. Modl < 75 : 37 : [4274, 13, 10]
107 .. Modl >= 75 : 40 : [3962, 13.5, 20]
108 .. Lbs >= 302 : 35 : [4054, 13.2, 20]
109 Lbs < 198 or Lbs >= 454 : 231 : [2290, 16, 30] <== best
110 ...
111
112 ## Theory
113
114 Take your time, think a lot
115 Why, think of everything you've got
116 For you will still be here tomorrow
117 But your dreams may not
118
119 This code has many sources. Semi-supervised learning, abduction, active
120 learning, sequential model-based optimization random projections,
121 multi-objective optimization and search-based SE (and duo), the
122 JTMS vs ATMS debate (and the curious omission of dekleer from showing
123 that world thrashing is common— which is something i saw as well),
124 case based reasoning (people don't think, they remember), requirements
125 engineering, Intersectionality
126
127 ## License
128
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136 and/or other materials provided with the distribution.

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146 LIABILITY, WHETHER IN CONTRACT, STRICT LIABILITY, OR TORT (INCLUDING
147 NEGLIGENCE OR OTHERWISE) ARISING IN ANY WAY OUT OF THE USE OF THIS
148 SOFTWARE, EVEN IF ADVISED OF THE POSSIBILITY OF SUCH DAMAGE.
149
150
151 import traceback, random, copy, math, sys, re
152 import random as rnd
153 from typing import Any
154 r = rnd.random

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155 #
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161 #
162
163 def any(a:list) -> Any:
164     "Return a random item."
165     return a[anywhere(a)]
166
167 def anywhere(a:list) -> int:
168     "Return a random index of list 'a'."
169     return rnd.randint(0, len(a)-1)
170
171 big = sys.maxsize
172
173 def atom(x):
174     "Return a number or trimmed string."
175     x=x.strip()
176     if x=="True": return True
177     elif x=="False": return False
178     else:
179         try: return int(x)
180         except:
181             try: return float(x)
182             except: return x.strip()
183
184 def demo(do,all):
185     "Maybe run a demo, if we want it, resetting random seed first."
186     todo = dir(all)
187     if do and do != "all":
188         todo = [x for x in dir(all) if x.startswith(do)]
189     for one in todo:
190         fun = all.__dict__.get(one,"")
191         if type(fun)==type(demo):
192             rnd.seed(the.seed)
193             doc = re.sub(r'\n+', "\n", fun.__doc__ or "")
194             try:
195                 fun()
196                 print("PASS:", doc)
197             except Exception as e:
198                 all.fails += 0
199                 if the.cautious: traceback.print_exc(); exit(1)
200                 else: print("FAIL:", doc, e)
201     exit(all.fails)
202
203 def file(f):
204     "Iterator. Returns one row at a time, as cells."
205     with open(f) as fp:
206         for line in fp:
207             line = re.sub(r'([\n\r\v\"])#.*', '', line)
208             if line:
209                 yield [cell.strip() for cell in line.split(",")]
210
211 def first(a:list) -> Any:
212     "Return first item."
213     return a[0]
214
215 def merge(b4:list) -> list:
216     "While we can find similar adjacent things, merge them."
217     j,n,now = -1,len(b4),[]
218     while j < n-1:
219         j += 1
220         a = b4[j]
221         if j < n-2:
222             if merged := a.merge(b4[j+1]):
223                 a = merged
224                 j += 1 # we will continue, after missing one
225         now += [a]
226     # if 'now' is same size as 'b4', look for any other merges.
227     return b4 if len(now)==len(b4) else merge(now)
228
229 class o(object):
230     "Class that can pretty print its slots, with fast inits."
231     def __init__(i, **d): i.__dict__.update(**d)
232     def __repr__(i):
233         pre = i.__class__.__name__ if isinstance(i,o) else ""
234         return pre+'('+'('+' '.join([f'{k} {v}' for k, v in
235                                     sorted(i.__dict__.items()) if str(k)[0] != "_"])+')'+'?'
236
237 def options(doc:str) -> o:
238     """Convert 'doc' to options dictionary using command line args.
239     Args cause two 'shorthands': (1) boolean flags have no arguments (and mentioning
240     those on the command line means 'flip the default value'; (2) args need only
241     mention the first few of a key (e.g. -s is enough to select for -seed)."""
242     d={}
243     for line in doc.splitlines():
244         if line and line.startswith(" -"):
245             key, *_ = line.strip()[1:].split("#") # get 1st,last word on each line
246             for j,flag in enumerate(sys.argv):
247                 if flag and flag[0]=="-" and key.startswith(flag[1:]):
248                     x= "True" if x=="False" else "False" if x=="True" else sys.argv[j+1])
249             d[key] = atom(x)
250     if d["help"]: exit(print(re.sub(r'\n#.*', "",doc,flags=re.S)))
251     return o(**d)
252
253 def per(a, p=.5):
254     "Return the p-th item in 'a'."
255     return a[ int(p*len(a)) ]
256
257 def r() -> float:
258     "Return random number 0..1"
259     return rnd.random()
260
261 def rn(x:float, n=3) -> float:
262     "Round a number to three decimals."
263     return round(x,n)
264
265 def rN(a:list, n=3) -> list:
266     "Round a list of numbers to three decimals."
267     return [rn(x,n=n) for x in a]
268
269 def second(a:list) -> Any:
270     "Return second item."
271     return a[1]

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408 one, last = None, None
409 all = []
410 for x,y,n in sorted(xys, key=first):
411     if x != last:
412         last = x
413         one = Span(i, x,x)
414         all += [one]
415     one.add(x,y,n)
416     if len(all) > 1 : out += all
417 #
418 #
419 #
420 #
421 class Num(Col):
422     "Summarize numeric columns."
423     def __init__(i, size,**kw):
424         super().__init__(**kw)
425         i._all, i.lo, i.hi, i.max, i.ok = [], 1E32, -1E32, size, False
426
427     def add(i,x: float ,inc=1):
428         "Reservoir sampler. If '_all' is full, sometimes replace an item at random."
429         if x != "":
430             i.n += inc
431             i.lo = min(x,i.lo)
432             i.hi = max(x,i.hi)
433             if len(i._all) < i.max : i.ok=False; i._all += [x]
434             elif r() < i.max/i.n: i.ok=False; i._all[anywhere(i._all)] = x
435         return x
436
437     def all(i):
438         "Return '_all' sorted."
439         if not i.ok: i.ok=True; i._all.sort()
440         return i._all
441
442     def dist1(i,x,y):
443         if x=="?": y=i.norm(y); x=(1 if y<.5 else 0)
444         elif y=="?": x=i.norm(x); y=(1 if x<.5 else 0)
445         else : x,y = i.norm(x), i.norm(y)
446         return abs(x-y)
447
448     def div(i):
449         """Report the diversity of this distribution (using standard deviation).
450         &pm;2, 2.56, 3 &sigma; is 66,90,95%, of the mass. 2&sigma;. So one
451         standard deviation is (90-10)th divide by 2.4 times &sigma;."""
452         return (i.per(.9) - i.per(.1)) / 2.56
453
454     def merge(i,j):
455         "Return two 'Num's."
456         k = Num(i.max, at=i.at, txt=i.txt)
457         for x in i._all: k.add(x)
458         for x in j._all: k.add(x)
459         return k
460
461     def mid(i):
462         "Return central tendency of this distribution (using median)."
463         return i.per(.5)
464
465     def norm(i,x):
466         "Normalize 'x' to the range 0..1."
467         return 0 if i.hi-i.lo < 1E-9 else (x-i.lo)/(i.hi-i.lo)
468
469     def per(i,p:float=.5) -> float:
470         "Return the p-th ranked item."
471         return per(i.all(), p)
472
473     def prep(i,x):
474         "Return 'x' as a float."
475         return x if x=="?" else float(x)
476
477     def spans(i,j, bins, out):
478         """Divide the whole space 'lo' to 'hi' into, say, 'xsmall'=16 bin,
479         then count the number of times we the bin on other side.
480         Then merge similar adjacent bins."""
481         lo = min(i.lo, j.lo)
482         hi = max(i.hi, j.hi)
483         gap = (hi-lo) / bins
484         xys = [(x,"this",1) for x in i._all] + [
485             (x,"that",1) for x in j._all]
486         one = Span(i.lo,lo)
487         all = [one]
488         for x,y,n in sorted(xys, key=first):
489             if one.hi - one.lo > gap:
490                 one = Span(i, one.hi,x)
491                 all += [one]
492             one.add(x,y,n)
493         all = merge(all)
494         all[0].lo = -big
495         all[-1].hi = big
496         if len(all) > 1: out += all
497 #
498 #
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500 #
501 #
502 class Example(o):
503     def __init__(i,cells):
504         "One example stores a list of cells."
505         i.cells=cells
506     def __getitem__(i,k):
507         "Accessor."
508         return i.cells[k]
509
510     def dist(i,j, sample):
511         "Separation of two examples."
512         cols, p = sample.x, sample.the.p
513         d = sum(col.dist(i[col.at], j[col.at])**p for col in cols)
514         return (d/len(cols)) ** (1/p)
515
516     def better(i,j, sample):
517         "Compare different goals."
518         n = len(cols)
519         for col in cols:
520             a,b = col.norm( i[col.at] ), col.norm( j[col.at] )
521             s1 -= math.e**(col.w*(a-b)/n)
522             s2 -= math.e**(col.w*(b-a)/n)
523         return s1/n < s2/n
524 #
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528 #
529 class Explain(o):
530     """Split the data using random projections. Find the span that most
531     separates the data. Divide data on that span."""
532     def __init__(i,sample, top=None):
533         i.here, i.span, i.yes, i.no = sample, None, None, None
534         top = top or sample
535         enough = len(top.rows)**top.the.enough
536         if len(sample.rows) >= 2*enough:
537             left, right,*_ = sample.half(top)
538             spans = []
539             bins = 6/top.the.xsmall
540             [lcol.spans(rcol, bins, spans) for lcol,rcol in zip(left.x,right.x)]
541             if len(spans) > 1:
542                 i.span = Span.sort(spans)[0]
543                 yes, no = sample.clone(), sample.clone()
544
545                 [(yes if i.span.selects(row) else no).add(row) for row in sample.rows]
546                 if enough <= len(yes.rows) < len(sample.rows): i.yes= Explain(yes,top)
547                 if enough <= len(no.rows) < len(sample.rows): i.no = Explain(no, top)
548
549     def show(i,pre=""):
550         "Pretty print"
551         if not pre:
552             tmp= i.here.mid(i.here.y)
553             print(f"{'':40} : {len(i.here.rows):5} : {tmp}")
554         for (status,kid) in [(True,i.yes), (False, i.no)]:
555             if kid:
556                 s=f"[pre]{i.span.show(status)}"
557                 tmp= kid.here.mid(kid.here.y)
558                 print(f"{'':40} : {len(kid.here.rows):5} : {tmp}")
559                 kid.show(pre + "|. ")
560 #
561 #
562 #
563 #
564 class Cluster(o):
565     "Tree with 'left','right' samples, broken at median between far points."
566     def __init__(i, sample, top=None):
567         i.left, i.right, i.x, i.y, i.c, i.mid = None, None, None, None, None, None
568         i.here = sample
569         top = top or sample
570         enough = len(top.rows)**top.the.enough
571         if len(sample.rows) >= 2*enough:
572             left, right, i.x, i.y, i.c, i.mid = sample.half(top)
573             if len(left.rows) < len(sample.rows):
574                 i.left = Cluster(left, top)
575             i.right = Cluster(right,top)
576
577     def show(i,pre=""):
578         "pretty print"
579         s= f"[pre:40] : {len(i.here.rows):5}"
580         print(f"{'':40} : {len(i.here.rows):5} : {s} : {i.here.mid(i.here.y)}")
581         for kid in [i.left,i.right]:
582             if kid: kid.show(pre + "|. ")
583 #
584 #
585 #
586 #
587 #
588 class Sample(o):
589     "Load, then manage, a set of examples."
590
591     def __init__(i, the, inits=[]):
592         """Samples hold 'rows', summarized in 'col'umns. The non-skipped columns
593         are stored in 'x,y' lists for independent and dependent columns. Also
594         stored is the 'klass' column and 'the' configuration options."""
595         i.the = the
596         i.rows, i.cols, i.x, i.y, i.klass = [], [], [], [], None
597         if str ==type(inits): [i.add(row, True) for row in file(inits)]
598         if list==type(inits): [i.add(row) for row in inits]
599
600     def add(i, a, raw=False):
601         """If we have no 'cols', this 'a' is the first row with the column names.
602         Otherwise 'a' is another row of data."""
603         if i.cols:
604             a = [ c.add( (c.prep(a[c.at]) if raw else a[c.at])) for c in i.cols ]
605             i.rows += [Example(a)]
606         else:
607             i.cols = [i.col(at,txt) for at,txt in enumerate(a)]
608
609     def clone(i,inits=[]):
610         "Generate a new 'Sample' with the same structure as this 'Sample'."
611         out = Sample(i.the)
612         out.add([col.txt for col in i.cols])
613         [out.add(x) for x in inits]
614         return out
615
616     def col(i,at,txt):
617         is_num = lambda x: x[0].isupper()
618         is_skip = lambda x: x[-1] == "."
619         is_klass = lambda x: "!" in x
620         is_goal = lambda x: "+" in x or "-" in x or is_klass(x)
621         if is_skip(txt):
622             return Skip(at=at,txt=txt)
623         else:
624             now = Num(i.the.Max,at=at,txt=txt) if is_num(txt) else Sym(at=at,txt=txt)
625             if is_klass(txt): i.klass = now
626             (i.y if is_goal(txt) else i.x).append( now )
627             return now
628
629     def far(i,x,rows):
630         "Return something 'far' percent away from 'x' in 'rows'."
631         return per(sorted([(x.dist(y,i),y) for y in rows],key=first), i.the.far)
632
633     def half(i, top=None):
634         "Using two faraway points 'x,y' break data at median distance."
635         some= i.rows if len(i.rows)<i.the.Some else rnd.choices(i.rows,k=i.the.Some)
636         top= top or i
637         w = any(some)
638         _,x= top.far(w, some)
639         c,y= top.far(x, some)
640         tmp= [row for _,row in sorted([(top.project(row,x,y,c), row)
641                                     for row in i.rows],key=first))]
642         mid= len(tmp)//2
643         return i.clone(tmp[:mid]), i.clone(tmp[mid:]), x, y, c, tmp[mid]
644
645     def mid(i,cols=None):
646         "Return a list of the mids of some columns."
647         return [col.mid() for col in (cols or i.all)]
648
649     def project(i,row,x,y,c):
650         "Find the distance of a 'row' on a line between 'x' and 'y'."
651         a = row.dist(x,i)
652         b = row.dist(y,i)
653         return (a**2 + c**2 - b**2) / (2*c)

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661
662 class Demos:
663     "Possible start-up actions."
664     fails=0
665     "Number of errors; returned to operating system as our exit code"
666     def opt():
667         "show the config."
668         print(the)
669
670     def seed():
671         "seed"
672         assert .494 <= r() <= .495
673
674     def num():
675         "check 'Num'."
676         n = Num(512)
677         for _ in range(100): n.add(r())
678         assert .30 <= n.div() <= .31, "in range"
679
680     def sym():
681         "check 'Sym'."
682         s = Sym()
683         for x in "aaaabbc": s.add(x)
684         assert 1.37 <= s.div() <= 1.38, "entropy"
685         assert 'a' == s.mid(), "mode"
686
687     def rows():
688         "count rows in a file."
689         assert 399 == len([row for row in file(the.data)])
690
691     def sample():
692         "sampling"
693         s = Sample(the, the.data)
694         print(the.data, len(s.rows))
695         print(s.x[3], s.rows[-1])
696         assert 398 == len(s.rows), "length of rows"
697         assert 249 == s.x[-1].has['l'], "symbol counts"
698
699     def dist():
700         "distance between rows"
701         s = Sample(the, the.data)
702         assert .84 <= s.rows[1].dist(s.rows[-1],s) <= .842
703
704     def clone():
705         "cloning"
706         s = Sample(the, the.data)
707         s1 = s.clone(s.rows)
708         d1,d2 = s.x[0].__dict__, s1.x[0].__dict__
709         for k,v in d1.items():
710             print(d2[k],v)
711             assert d2[k] == v, "clone test"
712
713     def half():
714         "divide data in two"
715         s = Sample(the, the.data)
716         s1,s2,*_ = s.half()
717         print(s1.mid(s1.y))
718         print(s2.mid(s2.y))
719
720     def cluster():
721         "divide data in two"
722         s = Sample(the, the.data)
723         Cluster(s).show(); print("")
724
725     def xplain():
726         "divide data in two"
727         s = Sample(the, the.data);
728         Explain(s).show(); print("")
729
730 #-----
731 the = options(__doc__)
732 if __name__ == "__main__": demo(the.todo,Demos)
733
734 """
735 Example class
736 """

```