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1 #!/usr/bin/env python3 -B
2 # vim: ts=2:sw=2:sts=2:et
3 """
4 binr.py : build rules via stochastic incremental XAI
5 (c) 2025, Tim Menzies, timm@ieee.org, mit-license.org
6 Options:
7   -h      Show help.
8   -b bins=4 Number of bins for discretization (int).
9   -B Budget=30 Max rows to eval (int).
10  -C CF=0.8 cross factor between two rows.
11  -e era=3 size factor between two nums.
12  -e era=10 Number of rows in an era (int)
13  -p p=2 Distance coefficient
14  -r repeats=20 Number of experimental repeats (int).
15  -s seeds=42 Random number seed (int).
16  -f file=/data/auto93.csv File to load (str).
17  -w w=1
18
19 from math import floor,sqrt,cos,log,exp,pi
20 from typing import Any,Iterable
21 import fileinput,random,sys,re
22 rand = random.random
23
24 class obj(dict):
25   """Structs with slots accessible via x.slot. And pretty print."""
26   def __repr__(self): return "[" + '/'.join(f"({k})[{o[ik]}]" for k in i) + "]"
27   def __setattr__(i, k, v): i[k] = v
28   def __getattribute__(i, k):
29     try: return i[k]
30     except KeyError: raise AttributeError(k)
31
32 the = obj(bins=4, Budget=30, CF=.8, era=10, F=0.3, p=2, repeats=20, seed=42,
33           file="/data/auto93.csv")
34
35 # types, upper case
36 QTY = float | int
37 ATOM = QTY | str | bool
38 ROW = list[ATOM]
39 ROWS = list[ROW]
40 NUM,SYM,TRI, COLS = obj, obj,obj,obj
41 Cols = list[COL]
42 COLS = list[list[COL]]
43 DATA = tuple[ROWS, COLS]
44
45 # Constructors, mixed case
46 def Sym(item=None) -> SYM:
47   "Symbolic value from a TRI/Num/Sym/Data summary."
48   return obj(i=Sym, n=0, has=has or {}, bins={})
49
50 def Num(mu=0, sd=1) -> NUM:
51   "Summarize numbers."
52   return obj(i=Num, n=0, mu=mu, sd=sd, m2=0, bins={})
53
54 def Tri(lo=0,mid=0.5,hi=1) -> TRI: # TRI used for generation (no updates)
55   return obj(i=Tri,n=0, lo=lo, mid=mid, hi=hi)
56
57 def Col(at=0, of=""") -> COL:
58   "Column in rows of data."
59   it = (Num if [0].isupper() else Sym)()
60   it.at = at
61   it.of = of
62   it.best = str(of)[-1]!="="
63   return it
64
65 def Cols(names:list[str]) -> COLS:
66   "Factory. Turn column names into columns."
67   cols = [Col(at=i, of=s) for i,s in enumerate(names)]
68   return obj(i=Cols, names=names,
69             all=cols,
70             x = [col for col in cols if str(col.of)[-1] not in "+-X"],
71             y = [col for col in cols if str(col.of)[-1] in "+-"])
72
73 def Data(rows = None) -> DATA:
74   "Summarize rows into columns."
75   return adds(rows, obj(it=Data, n=0, rows=[], cols=None))
76
77 def clone(data, rows=None) -> DATA:
78   "Mimic the structure of 'data'. Optionally, add some rows."
79   return adds(rows, Data([data.cols.names]))
80
81

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82   # - Add(i: NUM | SYM | DATA,   NOTE: TRI not supported (cant decrement lo,hi)
83   def add(i: NUM | SYM | DATA,   item: Any, inc = 1) -> Any: # returns item
84     "Add or subtract items from columns or data."
85     if item=="": return item
86     i.n += inc
87     if i.it is Sym:
88       i.has[item] = i.n + i.has.get(item,0)
89     elif i.it is Num:
90       item = float(item)
91       if i.n < 0 and i.n < 2:
92         i.n = i.mu = i.sd = i.m2 = 0
93       else:
94         d = item - i.mu
95         i.mu += inc * d / i.n
96         i.m2 += inc * d * (item - i.mu)
97         if i.n < 2 else sqrt(max(0,i.m2)/(i.n - 1))
98     elif i.it is Data:
99       i.cols.append(item)
100    else:
101      row = [add(c, item[c.at], inc) for c in i.cols.all]
102      i.rows.append(row) if inc > 0 else i.rows.remove(row)
103    else: i.cols = Cols(item)
104    return item
105
106 def sub(i: NUM | SYM):
107   i.has[i.item] = i.n + i.has.get(i.item,0)
108   if i.it is Num:
109     item = float(item)
110     if i.n < 0 and i.n < 2:
111       i.n = i.mu = i.sd = i.m2 = 0
112     else:
113       d = item - i.mu
114       i.mu += inc * d / i.n
115       i.m2 += inc * d * (item - i.mu)
116       if i.n < 2 else sqrt(max(0,i.m2)/(i.n - 1))
117     elif i.it is Data:
118       i.cols.append(item)
119       for c in i.cols.all:
120         row = [add(c, item[c.at], inc) for c in i.cols.all]
121         i.rows.append(row) if inc > 0 else i.rows.remove(row)
122       else: i.cols = Cols(item)
123       return item
124
125 def sub_i(item: Any):
126   "Subtract items."
127   return add(i=item, inc=-1)
128
129 def adds(items:Iterable, it=None, inc=None) -> obj: # returns it
130   "Load many items into 'it' (default is Num(''))."
131   if it is None: return None
132   if str(items)[-4]==".csv":
133     with open(items, encoding="utf-8") as f:
134       for line in f:
135         line: str; add(it, [s.strip() for s in line.split(",")])
136   else: add(it, [item for item in (items or [])])
137   return it
138
139 def sample(i: TRI | SYM | NUM | LIST) -> LIST:
140   "Sample a value from a TRI/Num/Sym/Data summary."
141   if type(i)==list: return sample(col) for col in i
142   if i.it is Num : return irwinHall3(i.mu, i.sd)
143   if i.it is Tri:
144     denom = (i.hi - i.lo) if (i.hi - i.lo) != 0 else 1e-32
145     p = (i.mu - i.lo) / denom
146     u,v = rand(), rand()
147     return i.lo + (i.hi - i.lo) * (min(u, v) + p * abs(u - v))
148   if i.it is Sym:
149     r = rand() * i.n
150     for x, count in i.has.items():
151       r -= count
152       if r <= 0: return x
153     return r
154
155 def mixes(data:DATA, np=100) -> Data:
156   "Return a new data containing 'n' samples from data."
157   any = lambda: random.choice(data.rows)
158   return [mix(data, any(), any()) for _ in range(np)]
159
160 def mix(data:DATA, a:ROW, b:ROW, c:ROW) -> ROW:
161   "Mutate 'a' by mixing items from 'bc'."
162   def num(z): return type(z) in [float,int]
163   if num(a) == num(b) == num(c):
164     a[i] = wrap(a, A + the.F*(B - C))
165   else:
166     keep = random.randrange(len(a))
167     for i,(A,B,C,col) in enumerate(zip(a,b,c,data.cols.all)):
168       if j := keep and rand() < the.CF:
169         d[j] = B if rand() < 0.5 else C
170       if col.it is Num and num(A) and num(B) and num(C):
171         d[j] = wrap(col, A + the.F*(B - C))
172   return a
173
174 def wrap(num,v):
175   "Rescale 'v' to the effective min,max range of 'num'."
176   hi, lo = max(2*num.sd, num.n), min(2*num.sd
177   if v>hi: return hi + ((lo-v) % (hi-lo))
178   if v<lo: return lo + ((v-hi) % (hi-lo))
179   return v
180
181

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182 def addid(i: COL | DATA) -> ATOM | ROW:
183   "Return the expected value of 'i'."
184   if i.it is Num: return i.mu
185   if i.it is Tri: return i.mid
186   if i.it is Sym: return max(i.has, key=i.has.get)
187   return [mid(col) for col in i.cols.all]
188
189 def shuffle(lst:list) -> list:
190   "Shuffle 'lst' in place."
191   random.shuffle(lst); return lst
192
193 def irwinHall3(mu=0, sd=1) -> float:
194   "Fast normal sampling: chatgpt.com/share/f035eb44-705c-8010-8782-454caaff8a5e"
195   return mu + sd * 2.0 * (rand() + rand() - 1.5)
196
197 def marsagliaPolar(mu=0, sd=1) -> float:
198   "Slightly slower normal sampling."
199   while True:
200     u,v = 2*rand()-1, 2*rand()-1
201     s = u*u+v*v
202     if 0 < s < 1: return mu + sd*u*sqrt(-2*log(s)/s)
203
204 def norm(num:Num, v:QTY) -> float:
205   "Returns 0.1."
206   return 1/(1+exp(-1.702 * (v - num.mu)/(num.sd + le-32))) if v != "?" else v
207
208 def bin(c:COL, v:ATOM) -> int | ATOM:
209   "Returns 0.bins."
210   if v=="": return 0
211   return floor((the.bins * norm(col.v)) if v!="?" and col.it is Num else v
212
213 def dist(src:Iterable) -> float:
214   "Manhattan distance."
215   d,n = 0,0
216   for di in src:
217     d += abs(di)
218   d += dl ** the.p
219   return (d/n)**(1/the.p)
220
221 def disty(data:DATA, row:ROW) -> float:
222   "Distance of 'row' to 'best' values in each goal column."
223   return dist(abs(norm(col, row[col.at]) - col.best) for col in data.cols.y)
224
225 def distx(data:DATA, row1:ROW, row2:ROW) -> float:
226   "Distance between 'x' attributes of two rows."
227   return dist(_aha(col, row1[col.at], row2[col.at]) for col in data.cols.x)
228
229 def _aha(col:COL, a:ATOM, b:ATOM) -> float:
230   "Any unknowns, assume max distance."
231   if a==b=="": return 1
232   if col.it is Sym : return a == b
233   a,b = norm(col.a), norm(col.b)
234   a = a if a != "" else (0 if b>0.5 else 1)
235   b = b if b != "" else (0 if a>0.5 else 1)
236   return abs(a - b)
237
238 #
239 def scoreGet(use, row:ROW) -> ROW:
240   "Sum the score of the bins used by 'row'."
241   n = 0
242   for num in use:
243     if (v := row[num.at]) != "?":
244       print(v, num, bin(num.v))
245       if bin(v) == num.of:
246         n += want(num)
247       print(22)
248   return n
249
250 def scorePut(data:DATA, row:ROW, score:QTY):
251   "Increment the bins used by 'row'."
252   for x in data.cols.x:
253     if (b := bin(x, row[x.at])) != "?":
254       one = x.bins[b]; x.bins.get(b) or Num()
255       one.at, one.of = x.at, b
256       addone(score)
257
258 def want(num): return num.mu + num.sd/sqrt(num.n)
259
260 def top(data):
261   return sorted((num for x in data.cols.x for num in x.bins.values()),key=want)
262
263 def score(data:DATA, eps=0.05):
264   "Guess next few scores using scores seen to date."
265   best_score, best_row = 1e32, None
266   rows = shuffle(data.rows)
267   seen, model = set(), Data([data.cols.names])
268   for j in range(len(rows)):
269     if len(seen) >= the.Budget: break
270     add(model, row)
271     scorePut(model, row, disty(model, row))
272     seen.add(id(row))
273     if (j+1) % the.eps == 0 and j < len(rows) - 100:
274       top(model)[1:5]
275       candidate = rows[j+1:j+20], key=lambda r: scoreGet(use, r)
276       seen.add(candidate)
277       if (score := disty(model, candidate)) < best_score - eps:
278         best_score, best_row = score, candidate
279
280   return best_score
281

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262 # o(x):
263 "Pretty print."
264 if type(x) is type(o) : return x.__name__ + '()' 
265 if type(x) is float : return str(int(x)) if x == int(x) else f'{x:.2f}' 
266 if type(x) is list : return "[" + ('.'.join(o(y) for y in x)) + "]"
267
268 return str(x)
269
270 # -----
271 def go_h(_) -> None:
272     print(_.doc__)
273
274 def go_the(_) -> None:
275     print(the__)
276
277 def go_n(n: str) -> None:
278     the.seed = float(n); random.seed(the.seed)
279
280 def go_sym(_) -> None:
281     print(adds("aaaabb",Sym()))
282
283 def go_nu(_) -> None:
284     print(adds(irwinHall3(10,2) for _ in range(10**3)))
285
286 def go_data(f = None) -> None:
287     data = Data(f or the.file)
288     print(data.cols.x[-1])
289     print(len(data.rows),data.rows[1])
290
291 def go_disty(f = None):
292     ys, data = Num(), Data(f or the.file)
293     print(*[col.of for col in data.cols.all], "y", sep="\n")
294     Y=lambda row: floor(100*disty(data, row))
295     for r in sorted(data.rows, key=Y)[:20]:
296         print(*r, Y(r), sep="\n")
297
298 def go_distsx(f = None):
299     xs, data = Num(), Data(f or the.file)
300     print(*[col.of for col in data.cols.all], "x", sep="\n")
301     X=lambda row: floor(100*distsx(data, row, data.rows[0]))
302     for r in sorted(data.rows, key=X)[:20]:
303         print(*r, X(r), sep="\n")
304
305 def go_inc(f=None):
306     data1 = Data(f or the.file)
307     data2 = clone(data1)
308     for row in data1.rows:
309         sub(data2, row)
310         if len(data2.rows)==50: print(o(mid(data2)))
311         print(o(mid(data2)))
312     for row in data1.rows[:-1]:
313         if len(data2.rows)==50: print(o(mid(data2)))
314         sub(data2, row)
315
316 def f(x) : return 1.61 + 2.1*x[0] - 3.5*(x[1]*2) + 4*(x[2]**3) - 5*(x[3]**4)
317 def fx(row) : print(best=row, y=f(row))
318
319 def go_random(_):
320     eden = [Num(100,1), Num(20,5), Num(10,4), Num(3,2)]
321     fx( min((sample(eden) for _ in range(1000)), key=f))
322
323 def go_holimb(_):
324     mu_ = 100,9
325     model = [Num(100,1), (*X2*,20,5), (*X3*,10,4), (*X4*,3,2)]
326     eden = [Num(mu_,sd_) for _,mu_,sd_ in model]
327     data = Data([is for s in S for s in model]) + [sample(eden) for _ in range(m)]
328     for _ in range(S):
329         tmp = clone(data, sorted(data.rows, key=f)[:m//2])
330         fx(tmp.rows[0])
331         data = clone(data, mixes(tmp,m))
332
333 def go_score(f=None):
334     my_ = lambda n: floor(100*n)
335     data = Data(f or the.file)
336     print(len(data.rows))
337     ys = adds(my(disty(data, row)) for row in data.rows)
338     print(f"({my(mu)-my(mu, sd=ys.sd)})")
339     print(*sorted(my(score(data)) for _ in range(the.repeats)))
340
341 _tests= (k:fun for k,fun in vars().items() if "go_" in k)
342
343 def go_all():
344     for k,fun in _tests.items(): print("\n----- "+k); fun_()
345
346 #
347 if __name__ == "__main__":
348     for n, fn in enumerate(sys.argv):
349         if fn := vars().get(f"fn{fn.replace('-', '_')}"):
350             random.seed(the.seed)
351             fn(sys.argv[n+1] if n < len(sys.argv)-1 else None)

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