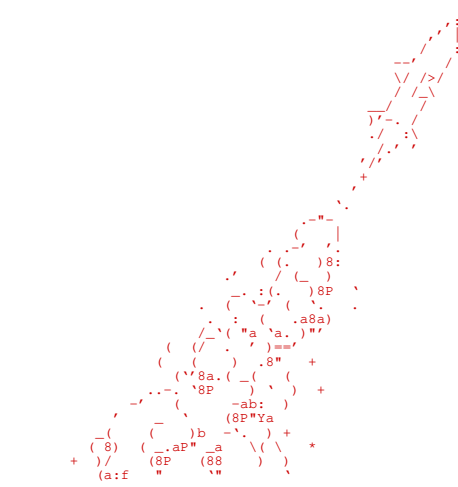


```

1 #!/usr/bin/env lua
2 -- vim: ts=2 sw=2 et:
3 -- (c) 2022, Tim Menzies
4 -- Usage of the works is permitted provided that this instrument is
5 -- retained with the works, so that any entity that uses the works is
6 -- notified of this instrument.  DISCLAIMER: THE WORKS ARE WITHOUT WARRANTY.
7 -----
8 local b4={}; for k,_ in pairs(_ENV) do b4[k]=k end
9 local help = [[
10
11 gate: explore the world better, explore the world for good.
12 (c) 2022, Tim Menzies
13
14      Ba      Bad <---- planning= (better - bad)
15      56      |      monitor = (bad - better)
16      |      |
17      |      v
18      Be      4      Better
19      |
20      -----
21
22 OPTIONS (inference control):
23 -k      int      Bayes: handle rare classes      = 2
24 -m      int      Bayes: handle rare values      = 1
25 -min     real     min size                        = .5
26 -seed    int      random number seed            = 10019
27 -keep    int      numbers to keep per column    = 512
28
29 OTHER:
30 -h              show help                        = false
31 -dump           enable stack dump on failures    = false
32 -file           file with data                   = ../etc/data/auto93.csv
33 -rnd            pretty print control for floats  = %5.3f
34 -todo          start-up action ("all" == run all) = the ]]
35 -----
36
37 -- define the local names
38 local the,go,no,fails = {}, {}, {}, 0
39 local abs,updates,cli,coerce,copy,csv,demos,ent,fu,fmt,fmt2,log,lt
40 local map,map2,max,merges,min,new,o,ok,obj,oo,ooo,per,push
41 local r,rnd,rnds,sd,settings,slots,sort,sum
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77 -----
78 -- maths
79 r= math.random
80 abs= math.abs
81 log= math.log
82 min= math.min
83 max= math.max
84 function ent(t, n,e)
85   n=0; for _,v in pairs(t) do n=n+v end
86   e=0; for _,v in pairs(t) do e=e-v/n*log(v/n,2) end; return e end
87
88 function per(t,p) return t[ ((p or .5)*#t) // 1 ] end
89
90 function sd(sorted,f, ninety,ten)
91   if #sorted <= 10 then return 0 end
92   ninety,ten = per(sorted, .90), per(sorted, .10)
93   if f then ninety,ten = f(ninety), f(ten) end
94   return (ninety-ten)/2.564 end -- 2*(1.2 + 0.1*(0.9-0.88493)/(0.9032-0.88493))
95
96 -- lists
97 function push(t,x) t[1 + #t] = x; return x end
98 function sort(t,f) table.sort(t,f); return t end
99 function map(t,f, u) u={};for _,v in pairs(t)do u[1+#u]=f(v) end;return u end
100 function map2(t,f, u) u={};for k,v in pairs(t)do u[k] = f(k,v) end;return u end
101
102 function copy(t, u)
103   if type(t) ~= "table" then return t end
104   u={};for k,v in pairs(t) do u[k]=copy(k,v) end; return u end
105
106 function slots(t, u,public)
107   function public(k) return tostring(k):sub(1,1) ~= "." end
108   u={};for k,v in pairs(t) do if public(k) then u[1+#u]=k end end
109   return sort(u) end
110
111 -- things to strings
112 fmt= string.format
113 fmt2= function(k,v) return fmt("%s %s",k,v) end
114
115 function ooo(t) print( #t>1 and o(t) or oo(t)) end
116 function o(t,s) return "["..table.concat(map(t,tostring),s or ",").."]" end
117 function oo(t,sep, slot)
118   function slot(k) return fmt2(k, t[k]) end
119   return (t.is or "")..o(map(slots(t),slot),sep or ",") end
120
121 function rnds(t,f) return map(t, function(x) return rnd(x,f) end) end
122 function rnd(x,f)
123   return fmt(type(x)=="number" and (x~x//1 and f or the.rnd) or"%s",x) end
124
125 -- strings to things
126 function coerce(x)
127   x = x:match("^%s*(-)%s*$")
128   if x=="true" then return true elseif x=="false" then return false end
129   return math.tointeger(x) or tonumber(x) or x end
130
131 function csv(src, things)
132   function things(s, t)
133     t={}; for y in s:gmatch("[^,]+") do t[1+#t]=coerce(y) end; return t end
134   src = io.input(src)
135   function f(x) x=io.read()
136   if x then return things(x) else io.close(src) end end end
137
138 -- misc
139 function fu(x) return function(t) return t[x] end end
140 function lt(x) return function(t,u) return t[x] < u[x] end end
141 function gt(x) return function(t,u) return t[x] > u[x] end end
142
143 function updates(obj,data)
144   if type(data)=="string"
145   then for row in csv(data) do obj:update(row) end
146   else for _,x in pairs(data or {}) do obj:update(x) end end
147   return obj end
148
149 function merge(i,j, k)
150   k = i + j
151   if k:div()*.95 <= (i.n*i:div() + j.n*j:div())/k.n then return k end end
152
153 function merges(b4, a,b,c,j,n,tmp)
154   j,n,tmp = 1,#b4,{}
155   while j<#n do
156     a, b = b4[j], b4[j+1]
157     if b then
158       c = merge(a,b)
159       if c then a, j = c, j+1 end end
160     tmp[#tmp+1] = a
161     j = j+1 end
162   return #tmp==#b4 and tmp or merges(tmp) end
163
164 -- startup, execution, unit tests
165 function settings(t,help)
166   help:gsub("\n [-](^%s+)%s%+[^%s%+]",function(k,x) t[k]=coerce(x) end)
167   return t end
168
169 function cli(the, flag)
170   for k,v in pairs(the) do
171     flag="--."..k
172     for n,flag1 in ipairs(arg) do
173       if flag1 == flag then
174         v = v==false and"true" or v==true and"false" or arg[n+1]
175         the[k] = coerce(v) end end end
176   if the.h then os.exit(print(help)) else return the end end
177
178 function ok(test,msg)
179   print("", test and "PASS"or "FAIL ", msg or "")
180   if not test then
181     fails= fails+1
182     if the.dump then assert(test,msg) end end end
183
184 function demos(the,go, demol,defaults)
185   function demol(txt,f)
186     assert(f, fmt("Unknown start-up action: %s",txt))
187     the = copy(defaults)
188     math.randomseed(the.seed or 10019)
189     print(txt)
190     f()
191   end -----
192   defaults = copy(the)
193   if the.todo=="all"
194   then for _,txt in pairs(slots(go)) do
195     demol(txt, go[txt]) end
196   else demol(the.todo, go[the.todo]) end end
197

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197 -----
198 function new(klass,...)
199   local obj = setmetatable({},klass)
200   local res = klass.new(obj,...)
201   if res then obj = setmetatable(res,klass) end
202   return obj end
203
204 function obj(name, t)
205   t={__toString=oo, is=name or ""}; t.__index=t
206   return setmetatable(t, {__call=new}) end
207
208 local Some,Sym,Num = obj"Some",obj"Sym",obj"Num"
209 local Bin,Cols,Egs = obj"Bin",obj"Cols",obj"Egs"
210 -----
211 function Bin:new(at,name, lo,hi,ys)
212   self.at, self.name = at or 0, name or ""
213   self.lo, self.hi, self.ys = lo, hi or lo, ys or Sym() end
214
215 function Bin:__toString()
216   local x,lo,hi,big = self.name, self.lo, self.hi, math.huge
217   if lo == hi then return fmt("%s=%s",x, lo)
218   elseif hi == big then return fmt("%s>=%s",x, lo)
219   elseif lo == -big then return fmt("%s<=%s",x, hi)
220   else return fmt("%s<=%s<%s",lo,x,hi) end end
221
222 function Bin:select(row)
223   local x, lo, hi = row[self.at], self.lo, self.hi
224   return x=="?" or lo == hi and lo == x or lo <= x and x < hi end
225
226 function Bin:update(x,y)
227   if x<self.lo then self.lo = x end
228   if x>self.hi then self.hi = x end
229   self.ys:update(y) end
230
231 function Bin:div() return self.ys:div() end
232
233 function Bin:__add(other)
234   return Bin(self.at, self.name, self.lo, after.hi, self.ys + other.ys) end
235 -----
236 function Sym:new(at,name)
237   self.at, self.name = at or 0, name or ""
238   self.n, self.has, self.mode, self.most = 0, {}, nil, 0 end
239
240 function Sym:update(x,inc)
241   if x ~= "?" then
242     inc = inc or 1
243     self.n = self.n + inc
244     self.has[x] = inc + (self.has[x] or 0)
245     if self.has[x] > self.most then self.most,self.mode = self.has[x],x end end
246   return x end
247
248 function Sym:mid() return self.mode end
249 function Sym:div() return ent(self.has) end
250
251 function Sym:like(x,prior)
252   return ((self.has[x] or 0) + the.m*prior)/(self.n + the.m) end
253
254 function Sym:__add(other, out)
255   out=Sym(self.at,self.name)
256   for x,n in pairs(self.has) do out:update(x,n) end
257   for x,n in pairs(other.has) do out:update(x,n) end
258   return out end
259
260 function Sym:bins(other)
261   local out = {}
262   local function known(x) out[x] = out[x] or Bin(self.at, self.name, x,x) end
263   for x,n in pairs(self.has) do known(x); out[x].ys:update("left", n) end
264   for x,n in pairs(other.has) do known(x); out[x].ys:update("right", n) end
265   return map(slots(out), function(k) return out[k] end) end

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266 -----
267 function Some:new()
268   self.kept, self.ok, self.n = {}, false, 0 end
269
270 function Some:update(x, a)
271   self.n = 1 + self.n
272   a = self.kept
273   if #a < the.keep then self.ok=false; push(a,x)
274   elseif r() < the.keep/self.n then self.ok=false; a[r(#a)]=x end end
275
276 function Some:has()
277   if not self.ok then table.sort(self.kept) end
278   self.ok = true
279   return self.kept end
280 -----
281 function Num:new(at,name)
282   self.at, self.name = at or 0, name or ""
283   self.w = self.name:find"$-" and -1 or 1
284   self.some=Some()
285   self.n,self.mu,self.m2,self.sd,self.lo,self.hi = 0,0,0,0,1E32,-1E32 end
286
287 function Num:update(x,_, a,d)
288   if x ~= "?" then
289     self.some:update(x)
290     self.n = self.n + 1
291     self.lo = min(x, self.lo)
292     self.hi = max(x, self.hi)
293     d = x - self.mu
294     self.mu = self.mu + d/self.n
295     self.m2 = self.m2 + d*(x - self.mu)
296     self.sd = (self.m2<0 or self.n<2) and 0 or ((self.m2/(self.n - 1))^0.5) end
297   return x end
298
299 function Num:__add(other, out)
300   out=Num(self.at,self.name)
301   for _,x in pairs(self.some.kept) do out:update(x) end
302   for _,x in pairs(other.some.kept) do out:update(x) end
303   return out end
304
305 function Num:mid() return self.mu end
306 function Num:div() return self.sd end
307
308 function Num:like(x,_)
309   local z, e, pi = 1E-64, math.exp(1), math.pi
310   if x < self.mu - 4*self.sd then return 0 end
311   if x > self.mu + 4*self.sd then return 0 end
312   return e^(-(x - self.mu)^2 / (z + 2*self.sd^2))/(z + (pi*2*self.sd^2)^.5) end
313
314 function Num:norm(x, lo,hi)
315   lo,hi = self.lo, self.hi
316   return x=="?" and x or hi-lo < 1E-9 and 0 or (x - lo)/(hi - lo) end
317
318 function Num:bins(other, tmp,out,now,epsilon,minSize)
319   tmp = {}
320   for _,x in pairs(self.some.kept) do push(tmp, {x=x, y="left"}) end
321   for _,x in pairs(other.some.kept) do push(tmp, {x=x, y="right"}) end
322   tmp = sort(tmp,lt"x") -- ascending on x
323   out = {}
324   now = push(out, Bin(self.at, self.name, tmp[1].x))
325   epsilon = sd(tmp,fu"x") * the.cohen
326   minSize = (#tmp)^the.leaves
327   for j,xy in pairs(tmp) do
328     if j > minSize and j + minSize < #tmp then -- leave enough for other bins
329       if now.ys.n > minSize then -- enough in this bins
330         if xy.x ~= tmp[j+1].x then -- there is a break in the data
331           if now.hi - now.lo > epsilon then -- "now" not trivially small
332             now = push(out, Bin(self.at, self.name, now.hi)) end end end end
333         now:update(xy.x, xy.y) end
334         out[j].lo = -math.huge
335         out[#out].hi = math.huge
336         return merges(out) end

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337 -----
338 function Cols:new(names, col)
339   self.names = names
340   self.all, self.x, self.y = {}, {}, {}
341   for at,name in pairs(names) do
342     col = push(self.all, (name:find"^[A-Z]" and Num or Sym) (at,name))
343     if not name:find"$" then
344       if name:find"$" then self.klass=col end
345       col.indep = not name:find"[+!]"
346       push(col.indep and self.x or self.y, col) end end end
347 -----
348 function Egs:new() self.rows, self.cols = {},nil end
349
350 function Egs:clone(data)
351   return updates(Egs():update(self.cols.name), data) end
352
353 function Egs:update(row, add)
354   add = function(col) col:update(row[col.at]) end
355   if self.cols then push(self.rows, map(self.cols,add)) else
356     self.cols = Cols(row) end end
357
358 function Egs:mid(cols)
359   return map(cols or self.cols.y, function(col) return col:mid() end) end
360
361 function Egs:div(cols)
362   return map(cols or self.cols.y, function(col) return col:div() end) end
363
364 function Egs:like(row,egs, n,prior,like,col)
365   n=0; for _,eg in pairs(egs) do n = n + #eg.rows end
366   prior = (#self.rows + the.k) / (n + the.k * #egs)
367   like = log(prior)
368   for at,x in pairs(row) do
369     col = self.cols.all[at]
370     if x ~= "?" and col.indep then like= like + log(col:like(x,prior)) end end
371   return like end
372
373 function Egs:better(row1,row2)
374   local s1, s2, n, e = 0, 0, #self.cols.y, math.exp(1)
375   for _,col in pairs(self.cols.y) do
376     local a = col:norm(row1[col.at])
377     local b = col:norm(row2[col.at])
378     s1 = s1 - e^(col.w * (a - b) / n)
379     s2 = s2 - e^(col.w * (b - a) / n) end
380   return s1 / n < s2 / n end
381
382 function Egs:betters()
383   return sort(self.rows, function(a,b) return self:better(a,b) end) end
384
385 function Egs:tree(other,min, kids,score)
386   function gain(col1, col2, all, sum, bins)
387     sum = 0
388     bins = col1:bins(col2)
389     map(bins, function(bin)
390       bin.here = self
391       bin.has = {self:clone(),self:clone()}
392       sum = sum + bin.ys.n/all * bin.ys:div() end)
393     return (bins=bins, gain=sum)
394   end -----
395   n = #self.rows + #other.rows
396   stop = stop or n^the.min
397   if n < stop
398     then return self
399   else cols = map2(self.col.x, function(at,col)
400     return {w=gain(col, other.col.x[at], n), col=col} end)
401     bins = sort(cols, fu"w")[1].bins
402     for at,eg in pairs(self,other) do
403       for _,row in pairs(eg.rows) do
404         for _,bin in pairs(bins) do
405           sub = bin.has[at]
406           if bin:select(row) then sub:update(row); break end end end end
407         self.kids = map(bins,
408           function(bin) bin.kid = bin.has[1]:tree(bin.has[2]) end) end end
409   -- XXX not done yet. need to return the ocal kids

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410 -----
411 function go.the() ooo(the) end
412
413 function go.ent() ok(abs(1.3788 - ent(a=4,b=2,c=1)) < 0.001,"enting") end
414
415 function go.ooo() ooo{cc=1,bb={ff=4,dd=5,bb=6}, aa=3} end
416
417 function go.copy( t,u)
418   t = {a=1,b=2,c={d=3,e=4,f={g=5,h=6}}}
419   u = copy(t)
420   t.c.f.g = 100
421   ok(u.c.f.g ~= t.c.f.g, "deep copy") end
422
423 function go.rnds() ooo(rnds{3.421212, 10.1121, 9.1111, 3.44444}) end
424
425 function go.csv( n)
426   n=0; for row in csv(the.file) do n=n+1 end; ok(n==399,"stuff") end
427
428 function go.some( s)
429   the.keep = 64
430   s = Some(); for i=1,10^6 do s:update(i) end
431   ooo(s:has()) end
432
433 function go.num( n,mu,sd)
434   n, mu, sd = Num(), 10, 1
435   for i=1,10^3 do
436     n:update(mu + sd*math.sqrt(-2*math.log(r()))*math.cos(2*math.pi*r)) end
437   ok(abs(n:mid() - mu) < 0.025, "sd")
438   ok(abs(n:div() - sd) < 0.05, "div") end
439
440 function go.updates( n)
441   print(updates(Num(),{1,2,3,4,5}) + updates(Num(),{11,12,13,14,15}))
442   end
443
444 function go.sym( s,mu,sd)
445   s= Sym()
446   for i=1,100 do
447     for k,n in pairs{a=4,b=2,c=1} do s:update(k,n) end end
448   ooo(s.has) end
449
450 -----
451 the = settings(the,help)
452
453 if pcall(debug.getlocal, 4, 1)
454 then return {Num=Num, Sym=Sym, Egs=Egs} -- called as sub-module. return classes
455 else the = cli(the) -- update 'the' from command line
456   demos(the,go) -- run some demos
457   for k,v in pairs(_ENV) do if not b4[k] then print("?",k,type(v)) end end
458   os.exit(fails) end

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