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1  -----
2  --- vim: ts=2 sw=2 et :
3  local b4,help = {},{}
4  LESSISMORE: best or test multi-objective optimization.
5  (c) 2022 Tim Menzies, tim@ieee.org
6  "I think the highest and lowest points are the important ones.
7  Anything else is just...in between." - Jim Morrison
8
9  USAGE:
10 alias lim="lua lessismore.lua"
11 lim [OPTIONS]
12
13 OPTIONS:
14 -H --how good or bad or novel = good
15 -m --min exponent of min size = .5
16 -b --bins max bins = 100
17 -s --seed random number seed = 10019
18 -S --some number of nums to keep = 256
19 -p --p exponent of distance = 2
20
21
22 OPTIONS (other):
23 -f --file where to find data = ../etc/data/auto93.csv
24 -h --help show help
25 -r --rnd rounding rules = %5.2f
26 -g --go start up action = nothing
27
28 Usage of the works is permitted provided that this instrument is
29 retained with the works, so that any entity that uses the works is
30 notified of this instrument.  DISCLAIMER:THE WORKS ARE WITHOUT WARRANTY.  ]]
31
32 -- ## Namespace
33 local thes={}
34 local big,copy,csv,demos,discretize,dist,eq,entropy,fill_in_the,fmt,gap,is,like,lt
35 local map,merge,mid,mode,mu,nasa93dem,norm,num,o,oo,pdf,per,push,rand,range
36 local rnd,rnds,row84,slice,sort,some,same,sd,string2thing,sym
37 local NUM,SYM,RANGE,EGS,COLS,ROW
38 for k,v in pairs(_ENV) do b4[k]=k end -- At end, use 'b4' to find rogue vars.
39
40 -- ## Coding Conventions
41 -- Separate policy from mechanism.
42 -- All 'magic parameters' that control code behavior should be part
43 -- of that help text. Allow for '-h' on the command line to print
44 -- help. Parse that string to set the options.
45 -- Dialogue independence.
46 -- Isolate and separate operating system interaction.
47 -- Test-driven development.
48 -- The 'go' functions store tests.
49 -- Tests should be silent unless they -- fail. -tests can be
50 -- disabled by renaming from 'go.fun' to 'no.fun'. Tests should
51 -- return 'true' if the test passes. On exit, return number of
52 -- failed tests.
53 -- Write less code.
54 -- "One of my most productive days was throwing away 1,000 lines of code."
55 -- (Ken Thompson);
56 -- "It is vain to do with more what can be done with less."
57 -- (William of Occam);
58 -- "Less, but better"
59 -- (Dieter Rams).
60 -- Good code is short code. If you know what is going on, the code
61 -- is shorter. While the code is longer, find patterns of processing
62 -- that combines N things into less things. Strive to write shorter.
63 -- Lots of short functions. Methods listed alphabetically.
64 -- Code 80 chars wide, or less. Functions in 1 line,
65 -- if you can. Indent with two spaces. Divide code into 120 line (or
66 -- less) pages. Use 'i' instead of 'self'.
67 -- Minimize use of local (exception: define all functions
68 -- local at top of file).
69 -- Encapsulation.
70 -- Use polymorphism but no inheritance (simpler
71 -- debugging). All classes get a 'new' constructor.
72 -- Use UPPERCASE for class names.
73 -- Class,Responsibilities,Collaborators.
74 -- Each class is succinctly documented as a set of collaborations
75 -- to fulfill some -- responsibility.
76
77 -- ## About the Learning
78 -- Data is stored in ROWs.
79 -- Beware missing values (marked in "?") and avoid them
80 -- Where possible all learning should be incremental.
81 -- Standard deviation and entropy generalized to 'div' (diversity);
82 -- Mean and mode generalized to 'mid' (middle);
83 -- Rows are created once and shared between different sets of
84 -- examples (so we can accumulate statistics on how we are progressing
85 -- inside each row).
86 -- When a row is first created, it is assigned to a 'base'; i.e.
87 -- a place to store the 'lo,hi' values for all numerics.
88 -- XXX tables very useful
89 -- XXX table have cols. cols are num, syms, ranges
90

```

```

91 function nasa93dem()
92 local vl,l,n,h,vh,xhsl,2,3,4,5,6; return {
93   ["id","center","Year","prec","flex","resl","team","pmat","rely","data","cplx",
94     "ruse","docu","time","stor","pvol","acap","pcap","pcon",
95     "apex","plex","flex","tool","site","sced","kloc",
96     "effort","Defects","Months"],
97   (1,2,1979,h,h,h,vh,h,h,l,h,n,n,n,1,h,n,n,n,h,h,n,1,25.9,117.6,808,15.3),
98   (2,2,1979,h,h,h,vh,h,h,l,h,n,n,n,n,1,h,n,n,n,h,h,n,1,24.6,117.6,767,15),
99   (3,2,1979,h,h,h,vh,h,h,l,h,n,n,n,n,1,n,n,n,n,h,h,n,1,7.7,31.2,240,10.1),
100   (4,2,1979,h,h,h,vh,h,h,l,h,n,n,n,n,1,n,n,n,n,h,h,n,1,8.2,36.256,10.4),
101   (5,2,1979,h,h,h,vh,h,h,l,h,n,n,n,n,1,n,n,n,n,h,h,n,1,9.7,25.2,302,11),
102   (6,2,1979,h,h,h,vh,h,h,l,h,n,n,n,n,1,n,n,n,n,h,h,n,1,2.2,8.4,69,6.6),
103   (7,2,1979,h,h,h,vh,h,h,l,h,n,n,n,n,1,n,n,n,n,h,h,n,1,3.5,10.8,109,7.8),
104   (8,2,1982,h,h,h,vh,h,h,l,h,n,n,n,n,1,n,n,n,n,h,h,n,1,66.6,352.8,2077,21),
105   (9,1,1980,h,h,h,vh,h,h,l,h,n,n,n,n,1,h,n,n,n,h,h,n,1,7.5,32.226,13.6),
106   (10,1,1980,h,h,h,vh,n,n,1,h,n,n,n,n,1,h,vh,n,vh,n,n,n,20,72,566,14.4),
107   (11,1,1984,h,h,h,vh,n,n,1,h,n,n,n,n,1,h,h,n,vh,n,h,n,n,6,24,188,9.9),
108   (12,1,1980,h,h,h,vh,n,n,1,h,n,n,n,n,1,h,vh,n,vh,n,n,n,100,360,2832,25.2),
109   (13,1,1985,h,h,h,vh,n,n,1,h,n,n,n,n,1,h,n,vh,n,l,n,n,n,11,3,36.456,12.8),
110   (14,1,1980,h,h,h,vh,n,n,1,h,n,n,n,n,1,h,n,n,n,n,100,215,5438,30.1),
111   (15,1,1983,h,h,h,vh,n,n,1,h,n,n,n,n,1,h,h,n,vh,n,h,n,n,20,48,626,15.1),
112   (16,1,1982,h,h,h,vh,n,n,1,h,n,n,n,n,1,h,n,n,n,n,v,l,n,n,n,100,360,4342,28),
113   (17,1,1980,h,h,h,vh,n,n,1,h,n,n,n,n,xh,l,h,vh,n,vh,n,h,n,n,150,324,4868,32.5),
114   (18,1,1984,h,h,h,vh,n,n,1,h,n,n,n,n,1,h,n,n,n,h,h,n,n,31.5,60,986,17.6),
115   (19,1,1983,h,h,h,vh,n,n,1,h,n,n,n,n,1,h,h,n,vh,n,h,n,n,15,48,470,13.6),
116   (20,1,1984,h,h,h,vh,n,n,1,h,n,n,n,n,xh,l,h,n,n,n,h,n,h,n,n,32.5,60,1276,20.8),
117   (21,2,1985,h,h,h,vh,h,h,l,h,n,n,n,n,1,n,n,n,n,1,13.7,60,614,13.9),
118   (22,2,1985,h,h,h,vh,h,h,l,h,n,n,n,n,1,n,n,n,n,n,1,66.6,352.8,2077,21),
119   (23,2,1985,h,h,h,vh,h,h,l,h,n,n,n,n,1,n,n,n,n,n,1,29.5,120,920,16),
120   (24,2,1986,h,h,h,vh,n,n,h,n,n,n,n,h,n,n,n,h,n,n,n,n,15.90,575,15.2),
121   (25,2,1986,h,h,h,vh,n,n,h,n,n,n,n,n,n,n,n,h,n,n,n,n,38,210,1553,21.3),
122   (26,2,1986,h,h,h,vh,n,n,h,n,n,n,n,h,n,n,n,h,n,n,n,n,45,42,128,12.4),
123   (27,2,1982,h,h,h,vh,n,n,vh,n,h,n,n,vh,vh,l,vh,n,n,h,l,h,n,n,15.4,70,765,14.5),
124   (28,2,1982,h,h,h,vh,h,n,vh,h,n,n,vh,vh,l,vh,n,n,h,l,h,n,n,1,48.5,239,2409,21.4),
125   (29,2,1982,h,h,h,vh,h,n,vh,h,n,n,vh,vh,l,vh,n,n,h,l,h,n,n,1,16.3,82,810,14.8),
126   (30,2,1982,h,h,h,vh,h,n,vh,h,n,n,vh,vh,l,vh,n,n,h,l,h,n,n,1,12.8,82,810,14.8),
127   (31,2,1982,h,h,h,vh,h,n,vh,h,n,n,vh,vh,l,vh,n,n,h,l,h,n,n,1,32.6,170,619,18.7),
128   (32,2,1982,h,h,h,vh,h,n,vh,h,n,n,vh,vh,l,vh,n,n,h,l,h,n,n,1,35.5,192,1763,19.3),
129   (33,2,1985,h,h,h,vh,h,h,l,h,n,n,n,n,1,n,n,n,n,n,1,5.5,18,172,9.1),
130   (34,2,1987,h,h,h,vh,h,h,l,h,n,n,n,n,1,n,n,n,n,n,1,10.4,36,324,11.2),
131   (35,2,1987,h,h,h,vh,h,h,l,h,n,n,n,n,1,n,n,n,n,n,1,14.60,457,12.4),
132   (36,2,1986,h,h,h,vh,n,n,n,n,n,n,n,n,n,n,n,n,n,n,n,6.5,420,90,12),
133   (37,2,1986,h,h,h,vh,n,n,n,n,n,n,n,n,n,n,n,n,n,n,n,13.60,683,14.8),
134   (38,2,1986,h,h,h,vh,n,n,n,n,n,n,n,n,n,n,n,n,n,n,n,90,444,334,26.7),
135   (39,2,1986,h,h,h,vh,n,n,n,n,n,n,n,n,n,n,n,n,n,n,n,65,420,90,12),
136   (40,2,1986,h,h,h,vh,n,n,n,n,n,n,n,n,n,n,n,n,n,n,n,16,114,887,16),
137   (41,2,1980,h,h,h,vh,h,n,h,n,h,n,n,vh,h,l,h,n,n,n,1,177.9,1248,7998,31.5),
138   (42,6,1975,h,h,h,vh,h,h,l,h,n,n,n,n,1,h,n,n,n,n,n,302,2400,8543,38.4),
139   (43,5,1978,h,h,h,vh,h,h,l,h,n,n,n,n,1,h,n,n,n,n,n,180,420,90,12),
140   (44,5,1982,h,h,h,vh,h,h,l,h,n,n,n,n,1,h,n,n,n,n,n,284.7,973,8518,38.1),
141   (45,5,1982,h,h,h,vh,n,n,h,n,n,n,n,n,1,n,h,n,h,n,n,n,79,400,2327,26.9),
142   (46,5,1977,h,h,h,vh,l,1,n,n,n,n,n,n,1,h,n,n,n,n,n,n,423,2400,18447,41.9),
143   (47,4,1978,h,h,h,vh,h,h,l,h,n,n,n,n,1,h,n,n,n,n,n,n,180,420,90,12),
144   (48,5,1984,h,h,h,vh,n,n,n,n,n,n,n,n,n,n,n,n,n,n,n,47.5,252,2007,22.2),
145   (49,5,1980,h,h,h,vh,l,1,vh,n,xh,n,n,h,h,l,1,n,n,n,h,n,h,n,n,21,107,1058,21.3),
146   (50,5,1983,h,h,h,vh,l,1,h,n,n,n,n,vh,n,n,h,n,h,n,h,n,n,78,571.4,4815,30.5),
147   (51,5,1979,h,h,h,vh,l,1,h,n,n,n,n,vh,n,n,h,n,h,n,h,n,n,4.98,98,70,15.5),
148   (52,5,1985,h,h,h,vh,l,1,n,n,n,n,n,vh,n,n,h,n,h,n,h,n,n,19.3,155,1191,18.6),
149   (53,5,1979,h,h,h,vh,l,1,h,n,vh,n,n,h,h,l,1,h,n,n,n,h,h,n,n,101,750,4840,32.4),
150   (54,5,1979,h,h,h,vh,l,1,h,n,n,n,n,h,h,l,1,n,n,n,h,n,h,n,n,219,2120,11761,42.8),
151   (55,5,1979,h,h,h,vh,l,1,h,n,n,n,n,h,h,l,1,n,n,n,h,n,h,n,n,50,370,2685,25.5),
152   (56,2,1979,h,h,h,vh,h,h,l,h,n,n,n,n,1,vh,vh,n,vh,n,vh,n,vh,n,1,227,1181,6293,33),
153   (57,2,1977,h,h,h,vh,h,n,h,n,h,vh,n,n,n,1,h,vh,n,n,1,70,278,2950,20.2),
154   (58,2,1979,h,h,h,vh,h,h,l,h,n,n,n,n,1,n,n,n,n,n,n,1,0.9,8.4,28,4.9),
155   (59,6,1974,h,h,h,vh,l,1,vh,l,xh,n,n,xh,vh,l,h,h,n,n,vh,vl,h,n,n,n,980,4560,50961,96),
156   (60,6,1975,h,h,h,vh,n,n,1,h,n,n,n,n,n,1,vh,vh,n,n,h,n,h,n,n,n,350,720,8547,35.7),
157   (61,5,1976,h,h,h,vh,h,h,n,xh,n,n,h,h,l,h,n,n,n,n,h,h,n,n,70,458,2404,27.5),
158   (62,5,1979,h,h,h,vh,h,h,n,xh,n,n,h,h,l,h,n,n,n,n,h,h,h,n,271,2460,9308,43.4),
159   (63,5,1971,h,h,h,vh,n,n,n,n,n,n,n,n,1,h,h,n,h,n,h,n,n,90,162,2743,25),
160   (64,5,1980,h,h,h,vh,n,n,n,n,n,n,n,n,1,h,n,h,n,n,h,n,n,40,150,1218,18.9),
161   (65,5,1979,h,h,h,vh,n,n,n,n,n,n,n,n,1,h,h,n,h,n,h,n,n,137,636,4210,32.2),
162   (66,5,1977,h,h,h,vh,n,n,h,n,n,n,n,h,n,h,h,l,h,n,n,h,n,n,n,150,882,5848,36.2),
163   (67,5,1976,h,h,h,vh,n,n,vh,n,h,n,n,h,n,1,h,n,n,h,n,h,n,n,339,444,8477,45.9),
164   (68,5,1983,h,h,h,vh,n,l,1,h,n,n,n,n,h,h,h,n,h,n,n,n,240,192,10313,37.1),
165   (69,5,1978,h,h,h,vh,l,1,h,n,n,n,n,n,vh,l,1,h,n,n,h,h,h,n,n,1,144,576,6129,28.8),
166   (70,5,1979,h,h,h,vh,l,1,n,n,n,n,n,vh,l,1,h,n,n,h,h,h,n,n,1,151,432,6136,26.2),
167   (71,5,1979,h,h,h,vh,l,1,n,n,n,n,n,vh,l,1,h,n,n,h,h,h,n,n,1,34,72,1555,16.2),
168   (72,5,1979,h,h,h,vh,l,1,n,n,n,n,n,n,vh,l,1,h,n,n,h,h,h,n,n,1,98,300,4907,24.4),
169   (73,5,1979,h,h,h,vh,l,1,n,n,n,n,n,n,vh,l,1,h,n,n,h,h,h,n,n,1,85,300,4256,23.2),
170   (74,5,1982,h,h,h,vh,l,1,n,n,n,n,n,n,vh,l,1,h,n,n,h,h,h,n,n,1,20,240,813,12.8),
171   (75,5,1978,h,h,h,vh,l,1,n,n,n,n,n,n,vh,l,1,h,n,h,h,h,h,n,n,1,111,600,4511,23.5),
172   (76,5,1978,h,h,h,vh,l,1,h,vh,h,n,n,n,vh,l,1,h,n,n,h,h,h,n,n,1,162,756,7553,32.4),
173   (77,5,1978,h,h,h,vh,l,1,h,vh,n,n,n,n,vh,l,1,h,n,n,h,h,h,n,n,1,352,1200,17597,42.9),
174   (78,5,1979,h,h,h,vh,l,1,h,n,vh,n,n,n,vh,l,1,h,n,h,h,h,h,n,n,1,165,97,7867,31.5),
175   (79,5,1984,h,h,h,vh,h,h,n,vh,n,n,h,h,l,1,h,n,n,n,h,h,n,n,60,409,2004,24.9),
176   (80,5,1984,h,h,h,vh,h,h,n,vh,n,n,h,h,l,1,h,n,n,n,h,h,n,n,100,703,3340,29.6),
177   (81,2,1980,h,h,h,vh,h,h,n,vh,n,n,h,h,l,1,h,n,n,n,h,h,n,n,32,1350,2984,33.6),
178   (82,2,1980,h,h,h,vh,h,h,n,vh,n,n,vh,xh,h,n,h,h,h,n,n,n,53,480,2227,28.8),
179   (83,3,1977,h,h,h,vh,h,h,l,1,vh,n,n,vh,xh,l,vh,vh,n,vh,vl,vl,h,n,n,41,599,1594,23),
180   (84,3,1977,h,h,h,vh,h,h,l,1,vh,n,n,vh,xh,l,vh,vh,n,vh,vl,vl,h,n,n,24,430,933,19.2),
181   (85,5,1977,h,h,h,vh,h,h,n,vh,n,n,xh,xh,n,h,h,n,h,h,h,n,n,165,78,64,406,15.6),
182   (86,5,1977,h,h,h,vh,h,h,n,vh,n,n,xh,xh,n,h,h,n,h,h,h,n,n,65,1772.5,2468,34.5),
183   (87,5,1977,h,h,h,vh,h,h,n,vh,n,n,xh,xh,n,h,h,n,h,h,h,n,n,70,1645.9,2658,35.4),
184   (88,5,1977,h,h,h,vh,h,h,n,xh,n,n,xh,xh,n,h,h,n,h,h,h,n,n,50,1924.5,2102,34.2),
185   (89,5,1982,h,h,h,vh,l,1,vh,n,n,vh,xh,l,vh,l,h,n,n,1,25,64,406,15.6),
186   (90,5,1980,h,h,h,vh,h,h,n,vh,n,n,xh,xh,n,h,h,n,h,h,h,n,n,233,8211,8848,53.1),
187   (91,2,1983,h,h,h,vh,n,h,n,vh,n,n,vh,vh,h,n,n,n,n,1,1,n,n,16.3,480,1253,21.5),
188   (92,2,1983,h,h,h,vh,n,h,n,vh,n,n,vh,vh,h,n,n,n,n,1,1,n,n,6.2,12,477,15.4),
189   (93,2,1983,h,h,h,vh,n,h,n,vh,n,n,vh,vh,h,n,n,n,n,1,1,n,n,3,38,231,12), end

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191 -- ## Utils
192 -- Misc
193 local huge
194 big=math.huge
195 rand=math.random
196 fmt=string.format
197 same = function(x) return x end
198
199 -- Sorting
200 function sort(t,f) table.sort(t, f); return t end
201 function lt(x) return function(a,b) return a[x] < b[x] end end
202
203 -- Query and update
204 function map(t,f,u) u={};for k,v in pairs(t) do u[l+#u]=f(v) end; return u end
205 function push(t,x) t[l+#t]=x; return x end
206 function slice(t,i,j,k,u) u={};for k,v in pairs(t) do if k>=i and k<=j then u[k]=v end end
207 i,j = (i or 1)//1, (j or l)//1
208 k = (k and (j-i)/k or 1)!!
209 u={}; for n=i,j,k do u[l+#u] = t[n] end return u end
210
211 -- "Strings 2 things" coercion.
212 function string2thing(x)
213   x = x:match("^%s*(-)%s*$")
214   if x=="true" then return true elseif x=="false" then return false end
215   return math.tointeger(x) or tonumber(x) or x end
216
217 function csv(csvfile)
218   csvfile = io.input(csvfile)
219   return function(line, row)
220     line=io.read()
221     if not line then io.close(csvfile) else
222       row={} for x in line:gmatch("%l|h") do push(row,string2thing(x)) end
223     return row end end
224
225 -- "Things 2 strings" coercion.
226 function oo(t) print(o(t)) end
227 function o(t)
228   if #t>0 then return {"["..table.concat(map(t,tostoring),",").."]"} else
229     u={}; for k,v in pairs(t) do u[l+#u] = fmt("%.5s",k,v) end
230     return (t.is or " ")..."["..table.concat(sort(u),",").."]" end end
231
232 function rnds(t,f) return map(t, function(x) return rnd(x,f) end) end
233 function rnd(x,f)
234   return fmt(type(x)=="number" and (x-x)//1 and f or the.rnd) or "%s",x) end
235
236 -- Convert help string to a table. Check command line for any updates.
237 function fill_in_the(shortflag,longflag,sldot,x)
238   for n,flag in ipairs(arg) do
239     if flag==shortflag or flag==longflag then
240       if flag=="true" and true or flag=="false" and false or arg[n+1] end end
241     the[slot] = string2thing(x) end
242
243 -- Run demos, each time resetting settings and random seed. Return #failures.
244 local go,no={},() -- place to store enabled and disabled tests
245 function demos( fails,names,defaults,status)
246   fails=0 -- this code will return number of failures
247   names, defaults = {},{}
248   for k,f in pairs(go) do if type(f)=="function" then push(names,k) end end
249   for k,v in pairs(the) do defaults[k]=v end
250   if go[the.go] then names={the.go} end
251   for _,one in pairs(sort(names)) do
252     for k,v in pairs(defaults) do the[k]=v end -- for all we want to do
253     math.randomseed(the.seed or 10019) -- reset random number seed
254     io.stderr:write("\n")
255     status = go[one]() -- run demo
256     if status == true then
257       print("== Enro, one,status)
258       fails = fails + 1 end end
259     return fails end
260
261 -- Polymorphic objects.
262 function is(name, t,new)
263   function new(kl,...)
264     local x=metatable({},{kl}; kl.new(x,...); return x end
265     t = {__tostoring__=isname or ""; t.__index=t
266     return setmetatable(t, {__call=new}) end

```

```

267 COLS,EGS,NUM,RANGE,ROW,SYM=is"COLS",is"EGS",is"NUM",is"RANGE",is"SYM",is"ROW"
268
269
270 -- ## NUM
271 -- - For a stream of 'add'itions, incrementally maintain 'mu,sd'.
272 -- - 'Norm'alize data for distance and discretization calcs
273 -- - ('see 'dist' and 'range').
274 -- - Comment on 'like'lihood that something belongs to this distribution.
275 function NUM.new(i,at,txt)
276   i.at=at or 0; i.txt=txt or ""; i.lo,i.hi=big, -big
277   i.n,i.mu,i.m2,i.sd = 0,0,0,0; i.w=(txt or ""):find"-S" and -1 or 1 end
278
279 function NUM.add(i,x, d)
280   if x=="?" then return x end
281   i.n = i.n + 1
282   d = x - i.mu
283   i.mu = i.mu + d/i.n
284   i.m2 = i.m2 + d*(x - i.mu)
285   i.sd = (i.m2<0 or i.n<2) and 0 or ((i.m2/(i.n - 1))^0.5)
286   i.lo = math.min(i.lo,x)
287   i.hi = math.max(i.hi,x) end
288
289 function NUM.dist(i, x,y)
290   if x=="?" and y=="?" then return 1 end
291   if x=="?" then y = i:norm(y); x = y<.5 and 1 or 0
292   elseif y=="?" then x = i:norm(x); y = x<.5 and 1 or 0
293   else x,y = i:norm(x), i:norm(y) end
294   return math.abs(x - y) end
295
296 function NUM.like(i,x,_, e)
297   return (x < i.mu - 4*i.sd and 0 or x > i.mu + 4*i.sd and 0 or
298     2.7183^(-(x - i.mu)^2 / (z + 2*i.sd^2)) / (z + (math.pi^2*i.sd^2)^.5)) end
299
300 function NUM.merge(i,ranges,min, a,b,c,j,n,tmp)
301   function expand(t)
302     if #t<2 then return {} end
303     for j=2,#t do t[j].lo=t[j-1].hi end
304     t[1].x.lo, t[#t].x.hi = -big,big
305     return t
306   end
307   j,n,tmp = 1,#ranges,{}
308   while j<#n do
309     a, b = ranges[j], ranges[j+1]
310     if b then c = a:merge(b,min); if c then a,j = c,j+1 end end
311     tmp[#tmp+1] = a
312     j = j+1 end
313   return #tmp==#ranges and expand(tmp) or i:merge(tmp,min) end
314
315 function NUM.mid(i) return i.mu end
316
317 function NUM.norm(i,x)
318   return i.hi-i.lo<1E-9 and 0 or (x-i.lo)/(i.hi-i.lo+1/big) end
319
320 function NUM.range(i,x,n, b) b=(i.hi-i.lo)/n; return math.floor(x/b+0.5)*b end
321
322 -- ## SYM
323 -- - For a stream of 'add'itions, incrementally maintain count of 'all' symbols.
324 -- - Using that info, report 'dist', mode ('mid') symbol, and entropy
325 -- - ('div') of this distribution.
326 -- - Comment on 'like'lihood that something belongs to this distribution.
327 -- - Discretization of a symbol just returns that sym ('range').
328 function SYM.new(i,at,txt) i.at=at or 0; i.txt=txt or ""; i.n,i.all = 0,{} end
329
330 function SYM.add(i,x,n)
331   if x=="?" then return x end
332   n = n or 1
333   i.n=i.n+n; i.all[x] = n + (i.all[x] or 0) end
334
335 function SYM.dist(i,x,y) return (a==b and 0 or 1) end
336
337 function SYM.div(i, n,e)
338   e=0; for k,n in pairs(i.all) do e=-n/i.n*math.log(n/i.n,2) end ;return e end
339
340 function SYM.like(i,x,prior) return ((c.all[x] or 0)+the.m*prior)/(c.n+the.m) end
341
342 function SYM.merge(i,ranges,min) return ranges end
343
344 function SYM.mid(i)
345   m=0; for y,n in pairs(i.all) do if n>m then m,x=n,y end end; return x end
346
347 function SYM.range(i,x,_) return x end

```

```

348 -- ## RANGE
349 -- - For a stream of 'add'itions, incrementally maintain counts of 'x' and 'y'.
350 -- - Summarize 'x' as the 'lo,hi' seen so far and summarize 'y' in 'SYM' counts
351 -- - in 'y.all' (and get counts there using 'of').
352 -- - Support range sorting ('_lt') and printing ('__tostring').
353 -- - Check if this range's 'x' values 'select's for a particular row.
354 -- - Merge adjacent ranges if the entropy of the whole is less than the parts.
355 function RANGE.new(i,col,lo,hi,y)
356   i.col, i.x, i.y = col, (lo==0 or big, hi==hi or -big), (y or SYM()) end
357
358 function RANGE.__lt(i,j) return i.x.lo < j.x.lo end
359
360 function RANGE.__tostring(i)
361   local x, lo, hi = i.col.txt, i.x.lo, i.x.hi
362   if i.lo == hi then return fmt("%s==%s",x, lo)
363   elseif hi == big then return fmt("%s>=%s",x, lo)
364   elseif lo == -big then return fmt("%s<=%s", x, hi)
365   else return fmt("%s<=%s<%s",lo,x,hi) end end
366
367 function RANGE.add(i,x,y)
368   if x=="?" then return x end
369   i.x.lo = math.min(i.x.lo,x)
370   i.x.hi = math.max(i.x.hi,x)
371   i.y:add(y) end
372
373 function RANGE.merge(i,j,n0, k)
374   k = SYM(i.col.at, i.col.txt)
375   for x,n in pairs(i.y.all) do k:add(x,n) end
376   for x,n in pairs(j.y.all) do k:add(x,n) end
377   if i.y.n<(n0 or 0) or j.y.n<(n0 or 0) or (
378     (i.y:div(i)*i.y.n + j.y:div(j)*j.y.n)/k.n >= .99*k:div())
379   then return RANGE(i.col, i.x.lo, j.x.hi, k) end end
380
381 function RANGE.of(i,x) return i.y.all[x] or 0 end
382
383 function RANGE.score(i,goal,B,R, how)
384   how={}
385   how.good= function(b,r) return ((b<r or b+r < .05) and 0) or b^2/(b+r) end
386   how.bad= function(b,r) return ((r<b or b+r < .05) and 0) or r^2/(b+r) end
387   how.novel=function(b,r) return 1/(b+r) end
388   b, r, z = 0, 0, 1/big
389   for x,n in pairs(i.y.all) do
390     if x==goal then b = b+n else r=r+n end end
391     return how[the.how or "good"] (b/(B+z), z/(R+z)) end
392
393 function RANGE.selects(i,t, x)
394   t = t.cells and t.cells or t
395   x = t[i.at]
396   return x=="?" or (i.x.lo==i.x.hi and i.x.lo==x) or (i.x.lo<x and x<i.x.hi) end
397
398 -- ## ROW
399 -- - Using knowledge 'of' the geometry of the data, support distance calcs
400 -- - i ('_n_sub' and 'around') as well as multi-objective ranking ('__lt').
401 function ROW.new(i,eg, cells) i.of,i.cells = eg,cells end
402
403 function ROW.__lt(i,j, sl,s2,e,y,a,b)
404   y = i.of.cols.y
405   sl, s2, e = 0, 0, math.exp(1)
406   for _,col in pairs(y) do
407     a = col:norm(i.cells[col.at])
408     b = col:norm(j.cells[col.at])
409     s1 = s1 - e*(col.w*(a - b) / #y)
410     s2 = s2 - e*(col.w*(b - a) / #y) end
411   return sl/#y < s2/#y end
412
413 function ROW.__sub(i,j)
414   for _,col in pairs(i.of.cols.x) do
415     a,b = i.cells[col.at], j.cells[col.at]
416     inc = a=="?" and b=="?" and 1 or col:dist(a,b)
417     d = d + inc*the.p end
418   return (d / (#i.of.cols.x)) ^ (1/the.p) end
419
420 function ROW.around(i,rows)
421   return sort(map(rows or i.of.rows, function(j) return (dist=i-j,row=j) end),
422     lt="dist") end

```

```

423 -- ## COLS
424 -- - Factory for converting column 'names' to 'NUM's ad 'SYM's.
425 -- - Store all columns in -- 'all', and for all columns we are not skipping,
426 -- - store the independent and dependent columns distributions in 'x' and 'y'.
427 function COLS.new(i, names, head,row,col)
428   i.names=names; i.all={}; i.y={}; i.x={}
429   for at,txt in pairs(names) do
430     col = push(i.all, (txt:find"^[A-Z]" and NUM or SYM) (at, txt))
431     col.goalp = txt:find"^[+-]S" and true or false
432     if not txt:find"$" then
433       if txt:find"$" then i.klass=col end
434       push(col.goalp and i.y or i.x, col) end end end
435
436 -- ## EGS
437 -- - For a stream of 'add'itions, incrementally store rows, summarized in 'cols'.
438 -- - When 'adding', build new rows for new data. Otherwise reuse rows across
439 -- - multiple sets of examples.
440 -- - Supporting 'copy'ing of this structure, without or without rows of data.
441 -- - Replaces how much this set of examples 'like' a new row.
442 -- - Discretize columns as 'ranges' that distinguish two sets of rows
443 -- - (merging irrelevant distinctions).
444 -- - Summarize the 'mid'point of these examples.
445 function EGS.new(i, names) i.rows,i.cols = {}, COLS(names) end
446
447 function EGS.add(i,row, cells)
448   cells = push(i.rows, row.cells and row or ROW(i,row)).cells
449   for n,col in pairs(i.cols.all) do col:add(cells[n]) end end
450
451 function EGS.copy(i,rows, j)
452   j=EGS(i.cols.names); for _,r in pairs(rows or {}) do j:add(r) end;return j end
453
454 function EGS.like(i,t,overall, nHypotheses, c)
455   prior = (#i.rows + the.k) / (overall + the.k * nHypotheses)
456   like = math.log(prior)
457   for at,x in pairs(t) do
458     col=i.cols.all[at]
459     if x=="?" and not c.goalp then
460       like = math.log(col:like(x)) + like end end
461   return like end
462
463 function EGS.load(src, i)
464   if src==nil or type(src)=="string"
465   then for row in csv(src) do if i then i:add(row) else i=EGS(row)end end
466   else for _,row in pairs(src) do if i then i:add(row) else i=EGS(row)end end end
467   return i end
468
469 function EGS.mid(i,cols)
470   return map(cols or i.cols.y, function(c) return c:mid(i) end) end
471
472 function EGS.ranges(i,yes,no, out,x,bin,tmp,score)
473   out={}
474   for _,col in pairs(i.cols.x) do -- for each x col
475     tmp = {}
476     for _,what in pairs((rows=yes, klass=true), (rows=no, klass=false)) do
477       for _,row in pairs(what.rows) do x = row.cells[col.at]
478         if x=="?" then
479           bin = col:range(x,the.bins)
480           tmp[bin] = tmp[bin] or RANGE(col,x,x)
481           tmp[bin]:add(x, what.klass) end end end
482     tmp = map(tmp,same) -- a hack. makes tmp sortable (has consecutive indexes)
483     for _,range in pairs(col:merge(sort(tmp), (#yes+no)*the.min)) do
484       push(out,range) end end
485     score = function(range) return range:score(true,#yes,#no) end
486     return sort(out,score) end

```

```

489 -----
490 -- ## Code for tests and demos
491
492 -- Simple stuff
493 function go.the() return type(the.bins)=="number" end
494 function go.sort( t) return 0==sort((100,3,4,2,10,0))[1] end
495 function go.slice( t,u)
496   t = {10,20,30,40,50,60,70,80,90,100,110,120,130,140}
497   u = slice(t,3,#t,3)
498   t = slice(t,3,5)
499   return #t==3 and #u==4 end
500
501 function go.num( n,mu,sd)
502   n, mu, sd = NUM(), 10, 1
503   for i=1,10^4 do
504     n=add(mu*sd*math.sqrt(-2*math.log(rand()))*math.cos(2*math.pi*rand())) end
505     return math.abs(n.mu - mu) < 0.05 and math.abs(n.sd - sd) < 0.5 end
506
507 -- Can we read rows off the disk?
508 function go.rows( n,m)
509   m,n=0,0; for row in csv(the.file) do m=m+1; n=n+#row; end; return n/m==8 end
510
511 -- Can we turn a list of names into columns?
512 function go.cols( l)
513   is=COLS("Name","Age","ShoeSize-")
514   return l.y[1].w == -1 end
515
516 -- Can we read data, summarized as columns?
517 function go.egs( it)
518   it=EGS.load(nasa93dem())
519   return math.abs(it.cols.y[1].mu - 624) < 1 end
520   --for _,row in pairs(nasa93dem())do oo(row) end end
521   --it = EGS.load(the.file); return math.abs(2970 - it.cols.y[1].mu) < 1 end
522
523 -- Does discretization work?
524 function go.ranges( it,n,best,rest,min)
525   --it = EGS.load(the.file)
526   print(the.how)
527   it=EGS.load(nasa93dem())
528   print("all",o(rnds(it:mid()))))
529   it.rows = sort(it.rows)
530   for j,row in pairs(sort(it.rows)) do row.klass = 1+j//(#it.rows*.35/6) end
531   n = (#it.rows)^.5
532   best,rest = slice(it.rows,1,n), slice(it.rows, n+1, #it.rows, 3*n)
533   print("best",#best,o(rnds(it:copy(best):mid()))))
534   print("rest",#rest,o(rnds(it:copy(rest):mid()))))
535   tmp={}; for _,ranges in pairs(it:ranges(best,rest)) do
536     for at,range in pairs(ranges) do
537       push(tmp,range).val= range:score(true,#best,#rest) end end
538   for _,range in pairs(sort(tmp,lt*val)) do print(range.val, range) end
539   --oo(a:mid())
540   --oo(b:mid())
541   return math.abs(2970 - it.cols.y[1].mu) < 1 end

```

```

542 -----
543 -- ## Main
544
545 -- - Parse help text for flags and defaults, check CLI for updates.
546 -- - Maybe print the help (with some pretty colors).
547 -- - Run the demos.
548 -- - Check for rogue vars.
549 -- - Exit, reporting number of failures.
550 help:gsub("un ([~|^%s+)([%s]+)(-[~|^|^%s+)]^n)*%s([~|^%s+)*",fill_in_the)
551 if the.help then
552   print(help:gsub("%u%u+", "%127[31m%127[0m"]
553     :gsub("([~|^%s+)([%s]+)(-[~|^|^%s+)]^n)*%s([~|^%s+)*", "%127[33m%2127[0m%3"]),""))
554 else
555   local fails = demos()
556   for k,v in pairs(_ENV) do if not b4[k] then print("?",k,type(v)) end end
557   os.exit(fails) end

```