

```

1  -- ## class BIN: info on 2 cols
2  local all=require"all"
3  local obj=require"obj"
4  local big,fmt = _big, _fmt
5
6  --> BIN(xlo:num,xhi:num,ys:(NUM|SYM)):BIN ->
7  -- 'ys' stores values seen from 'xlo to 'xhi'.
8  local BIN = obj("BIN", function(xlo, xhi, ys)
9    i.lo, i.hi, i.ys = xlo, xhi, ys end)
10
11 -- add(i:BIN, x:num, y:(num|str) -> Ensure 'lo','hi' covers 'x'. Add 'y' to 'ys'.
12 function Bin.add(i,x,y)
13   i.lo = math.min(i.lo, x)
14   i.hi = math.max(i.hi, x)
15   ys:add(y) end
16
17 function Bin.hold(i, row)
18   local x = row.cells[i.ys.at]
19   return x=="*" or i.lo==i.hi or i.lo<x and x<i.hi end
20
21 function Bin.holds(i, rows)
22   return map(rows,function(row) if Bin.hold(i,row) then return row end end) end
23
24 function Bin.show(i)
25   local x,lo,hi = i.ys.txt, i.lo, i.hi
26   if lo == hi then return fmt("%s==%s",x, lo)
27   elseif hi == big then return fmt("%s>=%s",x, lo)
28   elseif lo == -big then return fmt("%s<=%s", x, hi)
29   else
30     return fmt("%s<=%s<%s",lo,x,hi) end end
31
32 local _merge, _simpler
33 function _merge(i,j, min)
34   local iy,jy = i.ys,j.ys
35   local ky = _merge(iy,jy)
36   if iy.n < min or jy.n<min or _simpler(ky,iy,jy) then
37     return BIN(i.lo, j.hi, ky) end end
38
39 function _simpler(i,this,that)
40   return i:div(i) <= (this.n*this:div() + that.n*that:div()) / i.n end
41
42 local function _merge(i,j, k)
43   k = i:clone()
44   for v,inc in pairs(i.kept, j.kept) do
45     for v,inc in pairs(kept) do k:add(v,inc) end end
46     return k end
47
48 function Bin.BINS(rows,col,y,yKlass)
49   y = y or function(row) return row:klass() end
50   yKlass = yKlass or Col.NEW
51   local n,list,dict = 0,{}, {}
52   for _,row in pairs(rows) do
53     local v = row.cells[col.at]
54     if v ~= "*" then
55       n = n + 1
56       local pos = Col.bin(col,v)
57       dict[pos] = dict[pos] or push(list, Bin(v,v,yKlass:clone()))
58       Bin.add(dict[pos], v, y(row)) end end
59   list = sort(list, lt"*")
60   list = col.is == "NUMS" and _merges(list, small(n)) or list
61   return (bins= list,
62     div = sum(list,function(z) return Col.div(z.ys)*z.ys.n/n end)) end
63
64 function _merges(b4, min)
65   local n,now = 1,{}
66   while n <= #b4 do
67     local merged = n<#b4 and Bin.merge(b4[n], b4[n+1], min)
68     now[#now+1] = merged or b4[n]
69     n = n + (merged and 2 or 1) end
70   return #now < #b4 and _merges(now,min) or _xpad(now) end
71
72 -- xpad the bins to cover any gaps from minus infinity to plus infinity
73 function _xpad(bins)
74   if #bins>1 then
75     for n=2,#bins do bins[n].lo = bins[n-1].hi end end
76   bins[1].lo, bins[#bins].hi = -big, big
77   return bins end

```

```

78 -- ## About
79
80 local all=require"lib"
81 all.the = all.opts{ {}
82 BAITTERRY: semi-supervised multi-objective optimization XAI
83 (c) 2022 Tim Menzies <tim@ieee.org> BSD2 license
84
85 From N items, find and explain the best ones, using just log(N) evals.
86 PASS1 (guess): eval two distant items on multi-objective criteria.
87 Prune everything nearest the worst one. Recurse on rest.
88 PASS2 (guess again): do it again, using better items from first pass.
89 PASS3 (explain): recursively discretize attributes on how well they
90 distinguish the best and worst items (seen in second pass).
91
92 USAGE:
93   lua go.lua [OPTIONS]
94
95 OPTIONS:
96   -M --Min      min size of space           = .5
97   -b --bins     max number of bins           = 16
98   -F --Far      how far to look for remove points = .9
99   -k --k        Bayes hack: low attribute frequency = 2
100  -m --m        Bayes hack: low class frequency = 1
101  -p --p        distance coefficient (2=Euclidean) = 2
102  -s --seed     random number seed           = 10019
103  -S --S       max number of nums to keep    = 256
104  -w --wait     wait this number before testing = 10
105
106 OPTIONS (other):
107   -f --file    file                        = ../data/auto93.csv
108   -g --go      start-up goal = nothing
109   -h --help    show help                  = false })
110
111 return all
112
113 -- This code contains
114 -- B(AI)TERRY (a set of AI-related classes) and
115 -- various AI tools, coded on top of B(AI)TERRY.
116
117 -- One of the idea here is that that there the thing we call "data
118 -- mining" shares many of its internal data structures and algorithms
119 -- with the thing we call "optimization". So once we build those
120 -- internal things, then building "data miners" or "optimizers"
121 -- is a pretty trivial extension.
122
123 -- ## Apps
124 -- Naive Bays Classifier
125
126 -- Trees (regression and decision)
127
128 -- Recursive random projections
129
130 -- SHORTER:
131 -- Semi-supervised multi-objective optimization XAI
132 -- (from N items, find and explain the best ones, using just log(N) evals).
133 -- PASS1 (guess): eval two distant items on multi-objective criteria.
134 -- Prune everything nearest the worst one. Recurse on rest.
135 -- PASS2 (guess again): do it again, using better items from first pass.
136 -- PASS3 (explain): recursively discretize attributes on how well they
137 -- distinguish the best and worst items (seen in second pass).
138
139 -- ## Coding conventions
140 -- Before reading this, it might be best to
141 -- review these [local coding conventions] (https://github.com/timm/shortr/blob/master/CONTRIBUTE.md).
142 -- ## Why this code?
143 -- This code is an experiment in "less-is-more". Death to mash-ups and their associat
144 -- ed
145 -- problems with technical debt and security problems that leak in from all
146 -- the parts used in the assembly.
147
148 -- <b>Tony Hoare:</b><br>
149 -- <em>"Inside every large program is a small program struggling to get out."</em><p>
150 -- <b>Alan Perlis:</b><br><em>"Simplicity does not precede complexity, but follows it."</em><p>
151 -- <b>Dieter Rams:</b><br><em>"Less, but better."</em>
152
153 -- Now that you've done _it_, did you really understand _it_? Let's check.
154
155 -- Can you do _it_ better?
156 -- Can you now
157 -- write _it_ in fewer lines and do you know how to make _it_ run faster?
158 -- Can you see how _it_ is same/different to other things?
159 -- And can you use those similarities to do more things with _it_?
160 -- Finally, can you teach _it_ quickly to newcomers?
161
162 -- E.g. do I understand a multi-objective semi-supervised explanation algorithms?
163 -- Well, Let's check.
164
165 -- Here's all that, most of which is coded in B(AI)TERRY
166 -- that could be used for other learners.
167
168 -- Also included here is literate programming,
169 -- self-documenting code and support for test-driven development.
170 -- All in around 500 lines of LUA: <br>
171
172 -- 'awk '!/^([ \t]*)$/[!+]*'
173 -- 'END (print n "lines")' *.lua'
174 -- => 500 lines
175
176 -- Share and enjoy.
177
178 -- ## Role Models
179 -- People that inspire me to code less, but better:<br>
180 -- [Jack Diederich] (https://www.youtube.com/watch?v=9pEzGHorH0), [Hilary Mason] (https://www.youtube.com/watch?v=12btv0yUPNQ),
181 -- [Brian McPeel] (https://brianmcfree.net/papers/ismir2011_sptree.pdf),
182 -- [Brian Kernighan] (https://www.oreilly.com/library/view/beautiful-code/9780596510046/ch01.html),
183 -- [Joel Grus] (https://github.com/joelgrus/data-science-from-scratch).<p>
184 -- Especially the LISPers: <br>
185 -- ([Peter Seibel] (https://gigamonkeys.com/book/))
186 -- ([Conrad Barski] (https://doc.lagout.org/programming/Lisp/Land%20of%20Lisp_%20Lea%20a%20C%20Program%20in%20Lisp%2C%20One%20Game%20at%20a%20Time%20%5BBarski%202010-11-5%20.pdf)
187 -- ([Paul Graham] (http://www.paulgraham.com/onlisp.html)<br>
188 -- ([Peter Norvig] (http://norvig.com/lispy.html)
189 -- ([Guy Steele] (https://dspace.mit.edu/bitstream/handle/1721.1/5790/AIM-353.pdf?sequence=2&isAllowed=y))))).
190

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191 -- ## class COLS: make NUMS or SYMs
192
193 local all=require"all"
194 local obj, push = all.obj, all.push
195 local NUM, SYM = require"NUM", require"SYM"
196
197 --> COLS(names:{str}):COLS -> Factory. Turns a list of names into NUMs or SYMs.
198 -- Goal columns get added to 'i.y' and others to 'i.x' (unless denoted 'ignored').
199 -- A klass column goes to 'i.klass'.
200 local COLS = obj("COLS", function(i,names)
201   i.names, i.x, i.y, i.all,i.klass, i.names = names, {}, {}, {}
202   for at,txt in pairs(names) do
203     local col = (txt:find("[A-Z]" and NUM or SYM) (at,txt)
204     push(i.all, col)
205     if not col.txt:find"$" then
206       push(col.txt:find"[4-5]" and i.y or i.x, col)
207     if col.txt:find"$" then i.klass=col end end end )
208
209 --> add(i:COLS: row:ROW) -> Update columns using data from 'row'.
210 function COLS.add(i,row)
211   for _,cols in pairs(i.x,i.y) do
212     for _,col in pairs(cols) do col:add(row.cells[col.at]) end end end
213
214 return COLS
215

```

```

216 -- ## Test suite.
217 local all = require"all"
218 local chat,cli, csv, maps, on = all.chat, all.cli, all.csv, all.maps, all.on
219 local settings, sort, the = all.settings, all.sort, all.the
220
221 local COLS, NUM, ROWS = require"COLS", require"NUM", require"ROWS"
222 local SOME, SYM = require"SOME", require"SYM"
223
224 -- To disable a test, rename it from 'go' to 'no'.
225 local go, no = {}, {}
226
227 -- Print 'the'.
228 function go.THE() chat(the); return true end
229
230 -- Sort some numbers.
231 function go.SORT() chat(sort(10,5,1,15,0)); return true end
232
233 -- Iterate over 2 lists
234 function go.MAPS()
235   chat(maps({1,2,3}, {10,20,30},
236     function(x,y) return x+y end)); return true end
237
238 -- Summarize stream of numbers
239 function go.NUMS()
240   local n=NUM(); for i=1,1000 do n:add(i) end; chat(n)
241   return true end
242
243 -- Keep a sample of 32 nums (out of 1000).
244 function go.SOME()
245   local s=SOME(32); for i=1,1000 do s:add(i) end
246   chat(sort(s.kept)); return true end
247
248 -- Summarize stream of symbols
249 function go.SYM()
250   local s=SYM()
251   for i=1,1000 do for _,c in pairs{"a","b"} do s:add(c) end end
252   chat(sort(s.kept)); return true end
253
254 -- Print CSV file.
255 function go.CSV() csv(the.file, chat); return true end
256
257 -- Try initializing some columns from a list of names.
258 function go.COLS() chat(COLS{"aa","Bb","Cc-"}x); return true end
259
260 -- Load data from a csv file to a ROWS object.
261 function go.ROWS( rs)
262   rs=ROWS():fill(the.file)
263   chat(rs.cols.x[1])
264   chat(rs.cols.y); return true end
265
266 -- Print klass names
267 function go.KLASS()
268   local file = "../data/diabetes.csv"
269   local s=SYM()
270   for _,row in pairs(ROWS():fill(file).rows) do s:add(row:klass()) end
271   chat(s.kept)
272   return true end
273
274
275 -----
276 -- ## Start
277 the = cli(the)
278 on(the, go)

```

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279 -- ## Library Functions
280 local lib={}
281 -- ## Linting
282
283 --> rogues() -> Find rogue locals. Run 'rogues()' _last_ after everything else.
284 local b4={}; for k,v in pairs(_ENV) do b4[k]=k end
285 function lib.rogues()
286   for k,v in pairs(_ENV) do if not b4[k] then print("?",k,type(v)) end end end
287 -- ## Maths
288
289 --> R(max:num=1):num -> return a random number '0..max'.
290 lib.R = math.random
291
292 --> rnd(x:num, places:int):num -> return 'x' rounded to some number of 'places'.
293 function lib.rnd(x, places)
294   local mult = 10^(places or 2)
295   return math.floor(x * mult + 0.5) / mult end
296
297 --> rnds(t:num, places:?int=2):t -> return items in 't' rounds to 'places'.
298 function lib.rnds(t, places)
299   u={};for k,x in pairs(t) do u[k] = rnd(x,places or 2) end; return u end
300 -- ## Lists
301
302 --> splice(t:tab, start=?int=1, stop:?num=#t, step:?num=1):t -> pull items
303 -- 'start' to 'stop', stepping by 'step'.
304 function lib.splice(t, start, stop, step)
305   u={}
306   for n=(start or 1)//1, (stop or #t)//1, (step or 1)//1 do u[1+#u]=t[n] end
307   return u end
308
309 --> sort(t:tab, f:fun) :tab -> Return 't', sorted of function 'f' (default "<"").
310 function lib.sort(t,f) table.sort(t,f); return t end
311 --> push(t:tab, x:any) :x -> Add 'x' to end of 't'; return 't'.
312 function lib.push(t,x) t[#t+1] = x; return x end
313 --> per(t:tab, p?:float=.5) :x -> Return 'p'-th ranked item from 't'.
314 function lib.per(t,p) p=p*#t//1; return t[math.max(1,math.min(#t,p))] end
315
316 --> same(x:any):any -> Return x, unchanged.
317 lib.same=function(x) return x end
318
319 --> map(t:tab, f:fun): tab ->
320 --> kap(t:tab, f:fun): tab ->
321 --> maps(list1:tab, list2:tab, f:fun): tab ->
322 --> kaps(list1:tab, f:fun): tab -> Return items in 't', filtered thru 'f'.
323 -- If 'f' returns nil, then the output table shrinks. 'kap' and 'kaps' pass the
324 -- key and value to 'f'. 'maps' and 'kaps' pass items from two lists.
325 function lib.map(t,f, u) u={};for _,x in pairs(t) do u[1+#u]=f(x) end;return u end
326 function lib.kap(t,f, u) u={};for k,x in pairs(t) do u[1+#u]=f(k,x) end;return u end
327 function lib.maps(t,u,f, v) v={};for k,x in pairs(t) do v[1+#v]=f(x,u[k]) end;return v end
328 function lib.kaps(t,u,f, v) v={};for k,x in pairs(t) do v[1+#v]=f(k,x,u[k]) end;return v end
329 -- ## String to thing
330
331 --> thing(s:str):any -> Coerce string to whatever
332 -- is simplest (boolean or integer or float or, if all else fails, a string).
333 function lib.thing(x)
334   u = x:match"^(%$|-)%$"
335   if x=="true" then return true elseif x=="false" then return false else
336     return math.tointeger(x) or tonumber(x) or x end end
337
338 --> words(s:str, sep:str, fun:fun):tab -> Return 't' filled with 's', split on 'sep'.
339 function lib.words(s,sep,fun, t)
340   fun = fun or lib.same
341   t={};for x in s:gmatch(lib.fmt("([%s]+)",sep)) do t[1+#t]=fun(x) end; return t end
342
343 --> csv(file:str, fun:fun):tab -> Call 'fun' with lines, split on ",",
344 function lib.csv(file, fun)
345   local file = io.input(file)
346   while true do
347     local line = io.read()
348     if not line then return io.close(file) else
349       fun(lib.words(line, ",", lib.thing)) end end end
350 -- ## Thing to string
351
352 --> fmt(s:str,...) :str -> emulate printf
353 lib.fmt=string.format
354
355 --> cat(t:tab):str -> Return table as string. For key-indexed lists, show keys (sorted)
356 function lib.cat(t, key,u)
357   function key(k,v) if (tostring(k)):sub(1,1)~="_" then return lib.fmt("[%s]%",k,v) end end
358   u = #t>1 and lib.map(t,f or tostring) or lib.sort(lib.kap(t,key))
359   return (t._is or "").."["..table.concat(u,"").."]" end
360
361 --> chat(t:tab):t -> Print table (as string). Return 't'.
362 function lib.chat(t) print(lib.cat(t)); return t end
363 -- ## Settings
364
365 --> opts(x:str) :tab -> Parse 'str' for lines with '---'; then pull keys+defaults.
366 function lib.opts(x)
367   local t = {}
368   x:gsub("^(%$|-)%$|[%s]+|[-][%s]+|[%u]%"..lib.thing(x) end)
369   t._HELP = x
370   return t end
371
372 --> cli(t:tab) :tab -> For keys in 't', look for updates on command-line.
373 -- Things with boolean defaults are flipped via '--flag'.
374 -- Other keys need '--flag value'. Print the help
375 -- (if '-h' appears on command line). Return a table with setting 'key's and
376 -- 'value's. IMPORTANT NOTE: this function alters/inplace the table 't'
377 -- that is passed in-- which means that it alters settings for anything pointing
378 -- to 't'.
379
380 function lib.cli(t)
381   for key,x in pairs(t) do
382     x = tostring(x)
383     local long, short = "--".key, "-"..key:sub(1,1)
384     for n,flag in ipairs(arg) do
385       if flag==short or flag==long then
386         x = x=="false" and "true" or x=="true" and "false" or arg[n+1]
387         t[key] = lib.thing(x) end end end
388     if t.help then os.exit(print(t._HELP:gsub("[%u]%"..lib.thing(x) end) end
389     return t end
390 -- ## Tests
391
392 --> on(opts:tab, tests:[fun]) -> Run some tests.
393 -- If 'opt.go=="all"', then run all tests, sorted on their name.
394 -- Before each test, reset random seed and the options 'opts'.
395 function lib.on(opts,tests)
396   local fails, old = 0, {}
397   for k,v in pairs(opts) do old[k]=v end
398   local t=opts.go=="all" and lib.kap(tests,function(k,_) return k end) or (opts.go)

```

```

399 for _,txt in pairs(lib.sort(t)) do
400   local fun = tests[txt]
401   if type(fun)=="function" then
402     for k,v in pairs(old) do opts[k]=v end -- reset opts to default
403     math.randomseed(opts.seed or 10019) -- reset seed to default
404     print(">> ",txt)
405     local out = fun()
406     if out ~= true then fails=fails+1
407       print(lib.fmt("FAIL: [%s] %s",txt,out or "")) end end end
408   lib.rogues()
409   os.exit(fails) end -- if fails==0 then our return code to the OS will be zero.
410 -- ## Objects
411
412 --> obj(name:str, fun:fun):object -> Return a klass 'name' with constructor 'fun'.
413 -- Add a unique 'id' and a 'tostring' method (that uses 'cat' (above)).
414 local _id = 0
415 function lib.obj(name,fun, t,new,x)
416   function new(kl,...) _id=_id+1; x=metatable({_id=_id,kl};fun(x,...); return x end
417   t = {__tostring=lib.cat,_id=name}; t.__index=t
418   return setmetatable(t, {__call=new}) end
419 -----
420 -- ## Return
421
422 return lib

```

```

424 -- ## class NB: classifier
425 local all=require"all"
426 local obj,push,the = all.obj, all.push, all.the
427
428 local NB = obj("NB", function (i,src,report)
429   i.overall, i.dict, i.list = nil, {}, {}
430   report = report or print
431   Data.ROWS(src, function(row)
432     if not i.overall then i.overall = ROWS(row) else -- (0) eat row!
433     row = i.overall:summarize(row) -- XX add to overall
434     if #i.overall.rows > the.wait then report(Row.klass(row), NB.guess(i,row)) end
435     NB.train(i,row) end end) -- add tp rows's klass
436   end)
437
438 function NB.train(i,row)
439   local kl = row:klass()
440   i.dict[kl] = i.dict[kl] or push(i.list,i.overall.clone()) --klass is known
441   i.dict[kl].txt = kl -- each klass knows its name
442   i.dict[k]:add(row) end -- update klass with row
443
444 function NB.keymax(i,row)
445   most,out = -1, nil
446   for key,rows in pairs(i.dict) do
447     tmp = rows:like(row,#i.list,#i.overall.rows)
448     if tmp > most then most,out = tmp,key end end
449   return key end
450
451 return NB
452

```

```

453 -- ## class NUM: summarize numbers
454 local all = require"all"
455 local obj,push,the = all.obj, all.push, all.the
456 local SOME = require"some"
457
458 --> NUM(at:?int, txt:?str) :NUM -> Summarize a stream of numbers.
459 local NUM = obj("NUM", function(i,at,txt)
460   i.at, i.txt, i.n, i.kept = at or 0, txt or "", 0, SOME(the.Some)
461   i.w = i.txt:find"$" end)
462
463 --> add(i:NUM: x:num, n:?int=1) -> 'n' times,update 'i''s SOME object.
464 function NUM.add(i,x,n)
465   if x ~= "?" then
466     for _ = 1,(n or 1) do i.n=i.n+1; i.kept:add(x) end end end
467
468 --> clone(i:(SYM|NUM)) : (SYM|NUM) -> Return a class of the same structure.
469 function NUM.clone(i) return NUM(i.at, i.txt) end
470
471 --> div(i:NUM):tab -> Return 'div'ersity of a column
472 -- (its tendency _not_ to be a its central tendency). To understand this code
473 -- recall 4pm;1 to 6pm;2 sds covers 66 to 95% of the Gaussian prob. In between,
474 -- at 6pm;1.28, we cover 90%. So (p90-p10)/(2*1.28) returns one sd.
475 function NUM.div(i)
476   local a=i.kept:has(); return (per(a,.9) - per(a,.1))/2.56 end
477
478 --> like(i:NUM, x:any) -> Return the likelihood that 'x' belongs to 'i'.
479 function NUM.like(i,x,...)
480   local sd,mu=i:div(), i:mid()
481   if sd==0 then return x==mu and 1 or 1/big end
482   return math.exp(-.5*((x - mu)/sd)^2) / (sd*((2*math.pi)^0.5)) end
483
484 --> mid(i:NUM):tab -> Return a columns' 'mid'ddle
485 function NUM.mid(i)
486   local a=i.kept:has(); return per(a,.5) end
487
488 --> norm(i:NUM, x:num):num -> Normalize 'x' 0..1 for lo..hi,
489 function NUM.norm(i,x)
490   local a=i.kept:has(); return (a[#a]-a[1])<1E-9 or (x-a[1])/(a[#a]-a[1]) end
491
492 return NUM
493

```

```

494 -- ## class ROW:hold 1 record
495 local all = require"all"
496 local obj = all.obj
497
498 --> ROW(of:ROWS, cells:tab) :ROW -> Place to store one record
499 -- (and stats on how it is used; e.g. 'i.evald=true' if we touch the y values.
500 local ROW = obj("ROW", function(i,of,cells)
501   i._of,i.cells,i.evald = of,cells,false end)
502
503 --> klass(i:ROW):any -> Return the class value of this record.
504 function ROW.klass(i) return i.cells[i._of.cols.klass.at] end
505
506 return ROW
507

```

```

508 -- ## class ROWS: store many ROW
509 local all = require"all"
510 local csv,map,obj = all.csv, all.map, all.obj
511 local push,rnd,the = all.push, all.rnd, all.the
512 local COLS,ROW = require"COLS",require"ROW"
513
514 --> ROWS(names?:{str}, rows?:{ROW}) :ROWS -> Place to store many ROWS
515 -- and summarize them (in 'i.cols').
516 local ROWS = obj("ROWS", function(i,names,rows)
517   i.rows, i.cols = {}, (names and COLS(names) or nil)
518   for _,row in pairs(rows or {}) do i:summarize(row) end end)
519
520 --> add(i:ROWS: row:ROW) -> add ROW to ROWS, update the summaries in 'i.cols'.
521 function ROWS.add(i,t)
522   t = t.cells and t or ROW(i,t)
523   if i.cols then i.cols:add(push(i.rows, t)) else i.cols=COLS(t.cells) end end
524
525 --> ROWS.clone(init?:{ROW}) :ROWS -> Return a ROWS with same structure as 'i'.
526 -- Optionally, 'init'ialize it with some rows. Add a pointer back to the
527 -- original table that spawned 'eve'rything else (useful for some distance calcs).
528 function ROWS.clone(i,init)
529   local j=ROWS(i.cols.names,init)
530   j._eve = i._eve or i
531   return j end
532
533 --> fill(i:ROWS: src:{str|tab}):ROWS -> copy the data from 'src' into 'i'.
534 function ROWS.fill(i,src)
535   local what2do = type(src)=="table" and map or csv
536   what2do(src, function(t) i:add(t) end)
537   return i end
538
539 --> like(i:ROWS,row:ROW,nklasses:num,nrows:num):num -> Return
540 -- P(H)*εprod<sub>i</sub> (P(E<sub>i</sub>|i</sub>>|H)). Do it with logs
541 -- to handle very small numbers.
542 function ROWS.like(i,row, nklasses, nrows)
543   local prior,like,inc,x
544   prior = (#i.rows + the.k) / (nrows + the.k * nklasses)
545   like = math.log(prior)
546   row = row.cells and row.cells or row
547   for _,col in pairs(i.cols.x) do
548     x = row[col.at]
549     if x and x ~= "?" then
550       inc = col:like(x,prior)
551       like = like + math.log(inc) end end
552   return like end
553
554 --> mids(i:ROW,p?:int=2,cols?:{COL}=i.cols.y):tab -> Return 'mid' of columnss
555 -- rounded to 'p' places
556 function ROWS.mids(i,p,cols, t)
557   t={}
558   for _,col in pairs(cols or i.cols.y) do t[col.txt]=col:mid(p) end
559   return rnd(t,p or 2) end
560
561 return ROWS
562

```

```

563 -- ## class SOME: keep some nums
564 local all=require"all"
565 local obj,push,R,sort,the= all.obj, all.push, all.R, all.sort, all.the
566
567 --> SOME(max?:int) :SOME -> collect, at most, 'max' numbers.
568 local SOME = obj("SOME", function(i,max)
569   i.kept, i.ok, i.max, i.n = {}, true, max, 0 end)
570
571 --> add(i:SOME: x:num)-> 'n' times,update 'i'.
572 -- Helper function for NUM. If full then at odds 'i.some/i.x', keep 'x'
573 -- (replacing some older item, at random).
574 function SOME.add(i,x)
575   if x ~= "?" then
576     i.n = i.n + 1
577     if #i.kept < i.max then i.ok=false; push(i.kept,x)
578     elseif R() < i.max/i.n then i.ok=false; i.kept[R(#i.kept)]=x end end end
579
580 --> has(i:SOME):tab -> Ensure contents are sorted. Return those contents.
581 function SOME.has(i)
582   i.kept = i.ok and i.kept or sort(i.kept); i.ok=true; return i.kept ; end
583
584 return SOME
585

```

```

586 -- ## Summarize data
587 local the=require"the"
588 local obj,per = _,obj,_,per
589
590 --- ## Adding
591 function ROWS.add(i,row)
592   i.cols:add( push(i.rows, t.cells and t or ROW(i,row))) end
593
594 function COLS.add(i,row)
595   for _,cols in pairs(i.x,i.y) do
596     for _,col in pairs(cols) do col:add(row.cells[col.at]) end end end
597
598 function NUM.add(i,x,n)
599   if x=="?" then return end
600   n = n or 1
601   for _=1,n do
602     if #i.kept < i.nums then i.ok=false; push(i.kept,x)
603     elseif R() < i.nums/i.n then i.ok=false; i.kept[R(#i.kept)]=x end end end
604
605 function SYM.add(i,x,n)
606   if x=="?" then return end
607   i.ok = false
608   i.kept[x] = n + (i.kept[x] or 0) end
609
610 --- ## Querying
611 function NUM.ok(i)
612   if not i.ok then table.sort(i.kept) end
613   i.ok = true
614   return i.kelp end
615
616 function NUM.mid(i) local a= i.ok(); return per(a,.5) end
617 function SYM.mid(i)
618   local mode,most = nil,-1
619   for x,n in pairs(i.kept) do if n > most then most, mode = n, x end end; return mode
620 end
621
622 function NUM.div(i) local a= i.ok(); return (per(a,.9)-per(a..1))/2.56 end
623 function SYM.div(i)
624   local e,log=0, function(x) return math.log(x,2) end
625   for x,n in pairs(i.kept) do if n > 0 then e+=- n/1.n*log(n/1.n) end end
626   return e end
627
628 --- ### Column Factory
629 -----
630 local go,no={},{}
631
632 function go.CHAT() chat(aa=1,bb=3,cc={1,2,3}); return true end
633
634 function go.ALL()
635   local fails,old = 0,{}
636   for k,v in pairs(the) do old[k]=v end
637   for k,v in pairs(go) do
638     if k=="ALL" then
639       math.randomseed(the.seed or 10019)
640       if v() == true then print("FAIL",k); fails=fails+1 end
641       for k,v in pairs(old) do the[k]=v end end end
642   os.exit(fails) end
643
644 (go[arg[2]] or same)()
645
646 -- local Rows=obj("Row", function(i,row) i.rows={}; i.cols=nil; i.categories={} end)
647 -- function Rows.add(i,row)
648 --   rs.kepts = rs.cols and maps(r.kepts,row,update) or i:categorize(kap(row,init) end
649 -- )
650 -- function Rows.categorize(i,cols)
651 --   for _,col in pairs(cols) do if not col.ignorep then
652 --     push(col.txt:find"[!+]"$* and i.categories.y or i.categories.y, col) end end
653 --   return end
654 --
655 -- function make(f,rows)
656 --   local function makel(row) if rows then rows:add(row) else rows=Rows(row) end
657 --   if type(src)=="table" then map(rows,makel) else csv(src,makel) end
658 --   return rows end
659

```

```

660 -- ## class SYM: summarize symbols
661
662 local all = require"all"
663 local obj,push,the = all.obj, all.push, all.the
664 --> SYM(at:?int, txt:?str) :SYM -> Summarize a stream of non-numerics.
665 local SYM = obj("SYM", function(i,at,txt)
666   i.at, i.txt, i.n, i.kept = at or 0, txt or "", 0, {} end)
667
668 --> add(i:SYM: x:sum, n:?int=1) -> Add 'n' count to 'i.kept[n]' .
669 function SYM.add(i,x,n)
670   if x ~= "" then
671     i.kept[x] = (n or 1) + (i.kept[x] or 0) end end
672
673 --> clone(i:SYM) :SYM -> Return a class of the same structure.
674 function SYM.clone(i) return SYM(i.at, i.txt) end
675
676 --> like(i:SYM,x:any,prior:num) :num -> return how much 'x' might belong to 'i'.
677 function SYM.like(i,x,prior)
678   return ((i.kept[x] or 0)+the.m*prior) / (i.n+the.m) end
679
680 --> mid(i:SYM):tab -> Return a columns' 'mid'ddle (central tendency).
681 function SYM.mid(i,p)
682   local max,mode=-1,nil
683   for x,n in pairs(i.kept) do if n > most then most,mode = n,x end end
684   return mode end
685
686 --> div(i:SYM):tab -> Return 'div'ersity of a column
687 -- (its tendency _not_ to be a its central tendency).
688 function SYM.div(i,p)
689   local ent, log = 0, function(x) return math.log(x,2) end
690   for x,n in pairs(i.kept) do if n > 0 then ent=ent - n/i.n*log(n/i.n) end end
691   return ent end
692
693 return SYM
694

```