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NNLSJo[A_, f_] := Module[{weights, w, d = A, b = f, i},
  weights = Table[w[i], {i, Dimensions[A][[2]]}];
  {Sqrt[#[[1]]], weights /. #[[2]]} &[
    NMinimize[Prepend[{(# >= 0 &) /@ weights}, (d.weights - b).(d.weights - b)], weights]]
]

(*Coded by Michael Woodhams, from algorithm by Lawson and Hanson,*)
(*"Solving Least Squares Problems", 1974 and 1995.*/)
bitsToIndices[v_] := Select[Table[i, {i, Length[v]}], v[[#]] == 1 &];
NNLS[A_, f_] := Module[{x, zeroed, w, t, Ap, z,
  q,  $\alpha$ , i, zeroedSet, positiveSet, toBeZeroed, compressedZ, Q, R},
  (*Use delayed evaluation so that these are recalculated on the fly as needed:*)
  zeroedSet := bitsToIndices[zeroed];
  positiveSet := bitsToIndices[1 - zeroed];
  (*Init x to vector of zeros,
  same length as a row of A*) debug["A=", MatrixForm[A]];
  x = 0 A[[1]];
  debug["x=", x];
  (*Init zeroed to vector of ones, same length as x*) zeroed = 1 - x;
  debug["zeroed=", zeroed];
  w = Transpose[A].(f - A.x);
  debug["w=", w];
  While[zeroedSet != {} && Max[w[[zeroedSet]]] > 0, debug["Outer loop starts."];
    (*The index t of the largest element of w,*) (*subject to the constraint
    t is zeroed*) t = Position[w zeroed, Max[w zeroed], 1, 1][[1]][1];
    debug["t=", t];
    zeroed[[t]] = 0;
    debug["zeroed=", zeroed];
    (*Ap = the columns of A indexed by positiveSet*)
    Ap = Transpose[Transpose[A][[positiveSet]]];
    debug["Ap=", MatrixForm[Ap]];
    (*Minimize (Ap.compressedZ - f) by QR decomp*) {Q, R} = QRDecomposition[Ap];
    compressedZ = Inverse[R].Q.f;
    (*Create vector z with 0 in
    zeroed indices and compressedZ entries elsewhere*) z = 0 x;
    z[[positiveSet]] = compressedZ;
    debug["z=", z];
    While[Min[z] < 0, (*There is a wart here: x can have zeros,
    giving infinities or indeterminates. They don't matter,
    as we ignore those elements (not in positiveSet) but
    it will produce warnings.*/) debug["Inner loop start"];
    (*find smallest x[[q]] / (x[[q]] - z[[q]])*) (*such that: q is not zeroed,
    z[[q]] < 0*)  $\alpha$  = Infinity;
    For[q = 1, q ≤ Length[x], q++, If[zeroed[[q]] == 0 && z[[q]] < 0,
       $\alpha$  = Min[ $\alpha$ , x[[q]] / (x[[q]] - z[[q])]];
      debug["After trying index q=", q, "  $\alpha$ =",  $\alpha$ ];]; (*if*);
    (*for*) debug[" $\alpha$ =",  $\alpha$ ];
    x = x +  $\alpha$  (z - x);

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debug["x=", x];
toBeZeroed = Select[positiveSet, Abs[x[[#]] < 10^-13 &];
debug["toBeZeroed=", toBeZeroed];
zeroed[[toBeZeroed]] = 1;
x[[toBeZeroed]] = 0;
(*Duplicated from above*)(*Ap=the columns of A indexed by positiveSet*)
Ap = Transpose[Transpose[A][[positiveSet]]];
debug["Ap=", MatrixForm[Ap]];
(*Minimize (Ap.compressedZ-f) by QR decomp*){Q, R} = QRDecomposition[Ap];
compressedZ = Inverse[R].Q.f;
(*Create vector z with 0 in
  zeroed indices and compressedZ entries elsewhere*)z = 0 x;
z[[positiveSet]] = compressedZ;
debug["z=", z]; (*end inner while loop*)x = z;
debug["x=", x];
w = Transpose[A].(f - A.x);
debug["w=", w]; (*end outer while loop*)Return[x]; (*end module*)

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