

Solution Set 9

Problem 1.

The point of this problem is to set up a simple linear programming problem. We wish to find the length of a string of N spheres of different radii in contact. We define this length as the distance between the centers of sphere 1 and sphere N . We call this distance L and it is equal to $r_1 + 2 \sum_{i=2}^{N-1} r_i + r_N$. In order to formulate this as a linear programming problem, we define the position of sphere i to be x_i . The object function is then

$$z = x_1 - x_N . \quad (1)$$

We have $N - 1$ constraints

$$x_{i+1} - x_i \geq r_{i+1} + r_i . \quad (2)$$

We set up a tableau as shown in *Numerical Recipes*, page 430 (setting $N=6$):

		x_1	x_2	x_3	x_4	x_5	x_6
z	0	1	0	0	0	0	-1
y_1	$-(r_1 + r_2)$	-1	1	0	0	0	0
y_2	$-(r_2 + r_3)$	0	-1	1	0	0	0
y_3	$-(r_3 + r_4)$	0	0	-1	1	0	0
y_4	$-(r_4 + r_5)$	0	0	0	-1	1	0
y_5	$-(r_5 + r_6)$	0	0	0	0	-1	1

with this tableau it is easy to implement the Kuenzi, Tzschach and Zehnder code of *Numerical Recipes* for this problem. Here is the resulting program:

```

program simp
c Length of N spheres in a row calculated using the simplex meth.
parameter(n=20,m=n-1,mp=m+2,np=n+1,m1=0,m2=m,m3=0)
dimension r(n),a(mp,np),iposv(mp),izrov(np)
ibm=4711
do i=1,1000
ibm=ibm*16807
enddo
rinv=0.5/(2.**31-1.)
do i=1,n
ibm=ibm*16807
r(i)=rinv*float(ibm)+0.5
enddo

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c Correct answer
  dcorr=r(1)+r(n)
  do i=2,n-1
    dcorr=dcorr+2.*r(i)
  enddo
  do j=1,mp
    do i=1,np
      a(j,i)=0.
    enddo
  enddo
  a(1, 2)= 1.
  a(1,n+1)=-1.
  do j=2,m+1
    a(j,1)=r(j-1)+r(j)
    a(j,j )=-1.
    a(j,j+1)= 1.
  enddo
  call simplx(a,m,n,mp,np,m1,m2,m3,icase,izrov,iposv)
  dregn=a(1,1)
  write(*,*) dregn,dcorr
end

c
c Subroutines from Numerical Recipes
c
  SUBROUTINE simplx(a,m,n,mp,np,m1,m2,m3,icase,izrov,iposv)
  INTEGER icase,m,m1,m2,m3,mp,n,np,iposv(m),izrov(n),MMAX,NMAX
  REAL a(mp,np),EPS
  PARAMETER (MMAX=100,NMAX=100,EPS=1.e-6)
CU USES simp1,simp2,simp3
  INTEGER i,ip,ir,is,k,kh,kp,m12,nl1,nl2,l1(NMAX),l2(MMAX),l3(MMAX)
  REAL bmax,q1
  if(m.ne.m1+m2+m3)pause 'bad input constraint counts in simplx'
  nl1=n
  do 11 k=1,n
    l1(k)=k
    izrov(k)=k
11  continue
  nl2=m
  do 12 i=1,m
    if(a(i+1,1).lt.0.)pause 'bad input tableau in simplx'
    l2(i)=i
    iposv(i)=n+i
12  continue
  do 13 i=1,m2

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13      l3(i)=1
      continue
      ir=0
      if(m2+m3.eq.0)goto 30
      ir=1
      do 15 k=1,n+1
      q1=0.
      do 14 i=m1+1,m
      q1=q1+a(i+1,k)
14      continue
      a(m+2,k)=-q1
15      continue
10      call simp1(a,mp,np,m+1,l1,nl1,0,kp,bmax)
      if(bmax.le.EPS.and.a(m+2,1).lt.-EPS)then
      icense=-1
      return
      else if(bmax.le.EPS.and.a(m+2,1).le.EPS)then
      m12=m1+m2+1
      if(m12.le.m)then
      do 16 ip=m12,m
      if(iposv(ip).eq.ip+n)then
      call simp1(a,mp,np,ip,l1,nl1,1,kp,bmax)
      if(bmax.gt.0.)goto 1
      endif
16      continue
      endif
      ir=0
      m12=m12-1
      if(m1+1.gt.m12)goto 30
      do 18 i=m1+1,m12
      if(l3(i-m1).eq.1)then
      do 17 k=1,n+1
      a(i+1,k)=-a(i+1,k)
17      continue
      endif
18      continue
      goto 30
      endif
      call simp2(a,m,n,mp,np,l2,nl2,ip,kp,q1)
      if(ip.eq.0)then
      icense=-1
      return
      endif
1      call simp3(a,mp,np,m+1,n,ip,kp)

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        if(iposv(ip).ge.n+m1+m2+1)then
        do 19 k=1,nl1
        if(l1(k).eq.kp)goto 2
19      continue
2      nl1=nl1-1
        do 21 is=k,nl1
        l1(is)=l1(is+1)
21      continue
        else
        if(iposv(ip).lt.n+m1+1)goto 20
        kh=iposv(ip)-m1-n
        if(l3(kh).eq.0)goto 20
        l3(kh)=0
        endif
        a(m+2,kp+1)=a(m+2,kp+1)+1.
        do 22 i=1,m+2
        a(i,kp+1)=-a(i,kp+1)
22      continue
20      is=izrov(kp)
        izrov(kp)=iposv(ip)
        iposv(ip)=is
        if(ir.ne.0)goto 10
30      call simp1(a,mp,np,0,l1,nl1,0,kp,bmax)
        if(bmax.le.0.)then
        icafe=0
        return
        endif
        call simp2(a,m,n,mp,np,l2,nl2,ip,kp,q1)
        if(ip.eq.0)then
        icafe=1
        return
        endif
        call simp3(a,mp,np,m,n,ip,kp)
        goto 20
        END
        SUBROUTINE simp1(a,mp,np,mm,ll,nll,iabf,kp,bmax)
        INTEGER iabf,kp,mm,mp,nll,np,ll(np)
        REAL bmax,a(mp,np)
        INTEGER k
        REAL test
        kp=ll(1)
        bmax=a(mm+1,kp+1)
        do 11 k=2,nll
        if(iabf.eq.0)then

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        test=a(mm+1,ll(k)+1)-bmax
        else
        test=abs(a(mm+1,ll(k)+1))-abs(bmax)
        endif
        if(test.gt.0.)then
        bmax=a(mm+1,ll(k)+1)
        kp=ll(k)
        endif
11    continue
        return
        END
        SUBROUTINE simp2(a,m,n,mp,np,l2,nl2,ip,kp,q1)
        INTEGER ip,kp,m,mp,n,nl2,np,l2(mp)
        REAL q1,a(mp,np),EPS
        PARAMETER (EPS=1.e-6)
        INTEGER i,ii,k
        REAL q,q0,qp
        ip=0
        do 11 i=1,nl2
        if(a(l2(i)+1,kp+1).lt.-EPS)goto 1
11    continue
        return
1    q1=-a(l2(i)+1,1)/a(l2(i)+1,kp+1)
        ip=l2(i)
        do 13 i=i+1,nl2
        ii=l2(i)
        if(a(ii+1,kp+1).lt.-EPS)then
        q=-a(ii+1,1)/a(ii+1,kp+1)
        if(q.lt.q1)then
        ip=ii
        q1=q
        else if (q.eq.q1) then
        do 12 k=1,n
        qp=-a(ip+1,k+1)/a(ip+1,kp+1)
        q0=-a(ii+1,k+1)/a(ii+1,kp+1)
        if(q0.ne.qp)goto 2
12    continue
2    if(q0.lt.qp)ip=ii
        endif
        endif
13    continue
        return
        END
        SUBROUTINE simp3(a,mp,np,i1,k1,ip,kp)

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      INTEGER i1,ip,k1,kp,mp,np
      REAL a(mp,np)
      INTEGER ii,kk
      REAL piv
      piv=1./a(ip+1,kp+1)
      do 12 ii=1,i1+1
      if(ii-1.ne.ip)then
      a(ii,kp+1)=a(ii,kp+1)*piv
      do 11 kk=1,k1+1
      if(kk-1.ne.kp)then
      a(ii,kk)=a(ii,kk)-a(ip+1,kk)*a(ii,kp+1)
      endif
11      continue
      endif
12      continue
      do 13 kk=1,k1+1
13      continue
      a(ip+1,kp+1)=piv
      return
      END

```

Problem 2.

It is not obvious that finding the ground state energy of a system with Hamiltonian

$$H = -a_1\phi_1 - a_2\phi_1\phi_2 - \cdots - a_N\phi_1 \cdots \phi_N \quad (3)$$

where $0 \leq \phi_i \leq 1$ is a linear programming problem. However, doing the change of variable

$$\begin{aligned}
\psi_1 &= \phi_1 , \\
\psi_2 &= \phi_1\phi_2 , \\
\psi_3 &= \phi_1\phi_2\phi_3 , \\
&\dots \\
\psi_N &= \phi_1 \cdots \phi_N ,
\end{aligned} \quad (4)$$

the Hamiltonian may be written

$$H = -a_1\psi_1 - a_2\psi_2 - \cdots - a_N\psi_N . \quad (5)$$

This transformation has introduced a series of constraints between the coordinates,

$$\begin{aligned}
\psi_1 &\geq \psi_2 , \\
\psi_2 &\geq \psi_3 , \\
&\dots \\
\psi_{N-1} &\geq \psi_N ,
\end{aligned} \quad (6)$$

i addition to

$$\begin{aligned}
\psi_1 &\leq 1, \\
\psi_2 &\leq 1, \\
&\dots \\
\psi_N &\leq 1.
\end{aligned}
\tag{7}$$

The linear programming problem thus consists in finding the maximum of the function $z = -H$, where H is defined in (5) given the constraints (6) and (7).

We construct a tableau as done in Problem 1 (assuming the $N = 6$):

		ψ_1	ψ_2	ψ_3	ψ_4	ψ_5	ψ_6
z	0	$-a_1$	$-a_2$	$-a_3$	$-a_4$	$-a_5$	$-a_6$
z_1	1	-1	0	0	0	0	1
z_2	1	0	-1	0	0	0	0
z_3	1	0	0	-1	0	0	0
z_4	1	0	0	0	-1	0	0
z_5	1	0	0	0	0	-1	0
z_6	1	0	0	0	0	0	-1
z_7	0	-1	1	0	0	0	1
z_8	0	0	-1	1	0	0	0
z_9	0	0	0	-1	1	0	0
z_{10}	0	0	0	0	-1	1	0
z_{11}	0	0	0	0	0	-1	1

z_1 to z_6 in this tableau constitute constraints (7) and z_7 to z_{11} constitute constraints (6). Here is the program implementing this:

```

program prot
c Minimum energy of a hierarchic protein model
parameter
c (n=25,np=n+1,m1=n,m2=n-1,m3=0,m=m1+m2+m3,mp=m+2,nsamp=1000)
dimension c(n),a(mp,np),iposv(mp),izrov(np)
ibm=5511
do i=1,1000
ibm=ibm*16807
enddo
rinv=0.5/(2.**31-1.)
emin=0.
do isamp=1,nsamp
do i=1,n
ibm=ibm*16807
c(i)=1.-2.*int(1.+rinv*float(ibm))
enddo

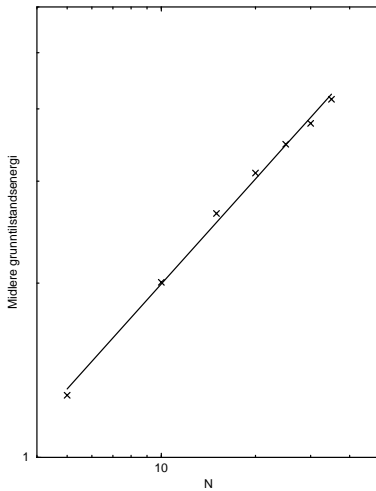
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```

do j=1,mp
do i=1,np
a(j,i)=0.
enddo
enddo
do i=2,n+1
a(1,i)=-c(i-1)
enddo
do j=2,1+m1
a(j,1)= 1.
a(j,j)=-1.
enddo
do j=2+m1,1+m1+m2
a(j,j-m1 )=-1.
a(j,j-m1+1)= 1.
enddo
call simplex(a,m,n,mp,np,m1,m2,m3,icase,izrov,iposv)
emin=emin-a(1,1)
enddo
write(*,*) n,emin/nsamp
end

```

The subroutines called here are the same as in Problem 1, so I do not repeat them. I generate 1000 samples for $N = 5, 10, 15, 20, 25, 30, 35$, and 40. Average ground state energy as a function of N is shown in this figure:



The straight line is $E_0 \propto N^{0.6}$. This data series is too small (but took about 10 minutes on my prehistoric SUN Sparc5) to draw any definite conclusions about the dependency of the ground state on N except that it goes to zero per degree of freedom as $N \rightarrow \infty$.