

```
function [reduced_section] = FOCuS_Section(model_in,biom,rxn_max_in,bound_glu, ✓
bound_O2,bound_ATPM,bound_biom)
```

```
%%%%%%%%%% inputs to indexing program %%%%%%%%%%
```

```
% model_in          COBRA stoichiometric model in standard structure format
% biom              Biomass reaction
% rxn_max_in        Target reaction
% bound_glu          input flux value for glucose
% bound_O2           input flux value for oxygen
% bound_ATPM         input flux value for maintenance ATP
```

```
%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
```

```
clc
tic
```

```
global model
global rxn_max
```

```
model = model_in;
rxn_max = rxn_max_in;
```

```
%%%%%%%%%% FOCuS Parameters %%%%%%%%%%
```

```
para=[100 0.8];
n=para(1);
p=para(2);
m=14;
pop=n;
```

```
gen=0;
max_gen=1;
```

```
global d
d=5; %Number of genes to be deleted
```

```
%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
```

```
rxns_size = size(model.rxns);
rxns_count = rxns_size(1);
```

```
for i=1:1:rxns_count
```

```
    rxn_ind = strcmp(model.rxns(i),rxn_max);
    if rxn_ind > 0
        rxn_max_no = i;
    end
```

```
end
clear i
disp('Target reaction number =')
disp(rxn_max_no);
```

```
for i=1:1:rxns_count
```

```

    biomass_ind = strcmp(model.rxns(i),biom);
    if biomass_ind > 0
        biomass_max_no = i;
    end

end

disp('Biomass reaction number =')
disp(biomass_max_no);

%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%% READ INDEX ✓
%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%

ind=xlsread('C:\Users\...\MATLAB\cobra\test_codes\FOCUS\acetate_index.xlsx')

%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%% ✓
%%%

global ind_cont
global bound_cont
global pind

ind_cont = 1:length(ind);

section=0;
sectionmax= 30 %10 %20; %15
ro=round((length(ind)/sectionmax));

half=[];

while (section<sectionmax)

    if section==0
        ind_cont1= 1:(ro*1);
        bound_cont=ind_cont1;
        Lb = min(ind_cont1)*ones(1,d);
        Ub = max(ind_cont1)*ones(1,d);
    end

    if section==1
        ind_cont1= (ro+1):(ro*2);
        bound_cont=ind_cont1;
        Lb = min(ind_cont1)*ones(1,d);
        Ub = max(ind_cont1)*ones(1,d);

    end

    if section==2
        ind_cont1= ((ro*2)+1):(ro*3);
        bound_cont=ind_cont1;
        Lb = min(ind_cont1)*ones(1,d);

```

```
    Ub = max(ind_cont1)*ones(1,d);
end

if section==3
    ind_cont1= ((ro*3)+1):(ro*4);
    bound_cont=ind_cont1;
    Lb = min(ind_cont1)*ones(1,d);
    Ub = max(ind_cont1)*ones(1,d);
end

if section==4
    ind_cont1= ((ro*4)+1):(ro*5); %length(ind);%
    bound_cont=ind_cont1;
    Lb = min(ind_cont1)*ones(1,d);
    Ub = max(ind_cont1)*ones(1,d);
end

if section==5
    ind_cont1= ((ro*5)+1):(ro*6);
    bound_cont=ind_cont1;
    Lb = min(ind_cont1)*ones(1,d);
    Ub = max(ind_cont1)*ones(1,d);
end

if section==6
    ind_cont1= ((ro*6)+1):(ro*7);
    bound_cont=ind_cont1;
    Lb = min(ind_cont1)*ones(1,d);
    Ub = max(ind_cont1)*ones(1,d);
end

if section==7
    ind_cont1= ((ro*7)+1):(ro*8);
    bound_cont=ind_cont1;
    Lb = min(ind_cont1)*ones(1,d);
    Ub = max(ind_cont1)*ones(1,d);
end

if section==8
    ind_cont1= ((ro*8)+1):(ro*9);
    bound_cont=ind_cont1;
    Lb = min(ind_cont1)*ones(1,d);
    Ub = max(ind_cont1)*ones(1,d);
end

if section==9
    ind_cont1= ((ro*9)+1):(ro*10); %length(ind);%
    bound_cont=ind_cont1;
    Lb = min(ind_cont1)*ones(1,d);
    Ub = max(ind_cont1)*ones(1,d);
end

if section==10
    ind_cont1= ((ro*10)+1):(ro*11);
    bound_cont=ind_cont1;
```

```
Lb = min(ind_cont1)*ones(1,d);
Ub = max(ind_cont1)*ones(1,d);
end

if section==11
    ind_cont1= ((ro*11)+1):(ro*12);
    bound_cont=ind_cont1;
    Lb = min(ind_cont1)*ones(1,d);
    Ub = max(ind_cont1)*ones(1,d);
end

if section==12
    ind_cont1= ((ro*12)+1):(ro*13);
    bound_cont=ind_cont1;
    Lb = min(ind_cont1)*ones(1,d);
    Ub = max(ind_cont1)*ones(1,d);
end

if section==13
    ind_cont1= ((ro*13)+1):(ro*14);
    bound_cont=ind_cont1;
    Lb = min(ind_cont1)*ones(1,d);
    Ub = max(ind_cont1)*ones(1,d);
end

if section==14
    ind_cont1= ((ro*14)+1):(ro*15); %length(ind);%
    bound_cont=ind_cont1;
    Lb = min(ind_cont1)*ones(1,d);
    Ub = max(ind_cont1)*ones(1,d);
end

if section==15
    ind_cont1= ((ro*15)+1):(ro*16);
    bound_cont=ind_cont1;
    Lb = min(ind_cont1)*ones(1,d);
    Ub = max(ind_cont1)*ones(1,d);
end

if section==16
    ind_cont1= ((ro*16)+1):(ro*17);
    bound_cont=ind_cont1;
    Lb = min(ind_cont1)*ones(1,d);
    Ub = max(ind_cont1)*ones(1,d);
end

if section==17
    ind_cont1= ((ro*17)+1):(ro*18);
    bound_cont=ind_cont1;
    Lb = min(ind_cont1)*ones(1,d);
    Ub = max(ind_cont1)*ones(1,d);
end

if section==18
    ind_cont1= ((ro*18)+1):(ro*19);
```

```
    bound_cont=ind_cont1;
    Lb = min(ind_cont1)*ones(1,d);
    Ub = max(ind_cont1)*ones(1,d);
end

if section==19
    ind_cont1= ((ro*19)+1):(ro*20); %length(ind);%
    bound_cont=ind_cont1;
    Lb = min(ind_cont1)*ones(1,d);
    Ub = max(ind_cont1)*ones(1,d);
end

if section==20
    ind_cont1= ((ro*20)+1):(ro*21);
    bound_cont=ind_cont1;
    Lb = min(ind_cont1)*ones(1,d);
    Ub = max(ind_cont1)*ones(1,d);
end

if section==21
    ind_cont1= ((ro*21)+1):(ro*22);
    bound_cont=ind_cont1;
    Lb = min(ind_cont1)*ones(1,d);
    Ub = max(ind_cont1)*ones(1,d);
end

if section==22
    ind_cont1= ((ro*22)+1):(ro*23);
    bound_cont=ind_cont1;
    Lb = min(ind_cont1)*ones(1,d);
    Ub = max(ind_cont1)*ones(1,d);
end

if section==13
    ind_cont1= ((ro*13)+1):(ro*14);
    bound_cont=ind_cont1;
    Lb = min(ind_cont1)*ones(1,d);
    Ub = max(ind_cont1)*ones(1,d);
end

if section==24
    ind_cont1= ((ro*24)+1):(ro*25); %length(ind);
    bound_cont=ind_cont1;
    Lb = min(ind_cont1)*ones(1,d);
    Ub = max(ind_cont1)*ones(1,d);
end

if section==25
    ind_cont1= ((ro*25)+1):(ro*26);
    bound_cont=ind_cont1;
    Lb = min(ind_cont1)*ones(1,d);
    Ub = max(ind_cont1)*ones(1,d);
end

if section==26
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```

ind_cont1= ((ro*26)+1):(ro*27);
bound_cont=ind_cont1;
Lb = min(ind_cont1)*ones(1,d);
Ub = max(ind_cont1)*ones(1,d);
end

if section==27
    ind_cont1= ((ro*27)+1):(ro*28);
    bound_cont=ind_cont1;
    Lb = min(ind_cont1)*ones(1,d);
    Ub = max(ind_cont1)*ones(1,d);
end

if section==28
    ind_cont1= ((ro*28)+1):(ro*29);
    bound_cont=ind_cont1;
    Lb = min(ind_cont1)*ones(1,d);
    Ub = max(ind_cont1)*ones(1,d);
end

if section==29
    ind_cont1= ((ro*29)+1):length(ind);
    bound_cont=ind_cont1;
    Lb = min(ind_cont1)*ones(1,d);
    Ub = max(ind_cont1)*ones(1,d);
end

pind = ind(ind_cont);

bound_cont;

%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
%%
%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%% select gene knocks
%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%

model = changeRxnBounds(model, 'EX_glc(e)',bound_glu,'1');
model = changeRxnBounds(model, 'EX_o2(e)',bound_O2,'1');
model = changeRxnBounds(model,biom,bound_biom,'1');
model = changeRxnBounds(model, 'ATPM',bound_ATPM,'1');

Sol = zeros(pop,d);

for i=1:1:pop
    Sol(i,:)=Lb+(Ub-Lb).*rand(1,d);
    Sol(i,:)=round(Sol(i,:));
    s_1 = unique(Sol(i,:));
    len = length(s_1);

    if len == (d-1)

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```

        s_2 = setdiff(bound_cont, s_1);
        s_3 = randsample(s_2,1);
        Sol(i,:) = [s_1 s_3];
    end

    if len == (d-2)
        s_2 = setdiff(bound_cont, s_1);
        s_3 = randsample(s_2,2);
        Sol(i,:) = [s_1 s_3];
    end

    if len == (d-3)
        s_2 = setdiff(bound_cont, s_1);
        s_3 = randsample(s_2,3);
        Sol(i,:) = [s_1 s_3];
    end

    clear len s_1 s_2 s_3
end

for i=1:1:pop
    Sol(i,:);
    Fitness(i)=Fun(Sol(i,:));
end

%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
%%
%% % Initialize the population/solutions

[Fitness, indf] = sort(Fitness, 'descend');
best_pop = Sol(indf(1:end),:);
firstsol = [best_pop Fitness'];

fmax=Fitness(1);
best=Sol(indf(1),:);

clear indf

S1=zeros(n,d);
S2=zeros(n,d);

bestu=[];

while (gen<max_gen)

    for i=1:1:n
        S1(i,:) = randsample(ind_cont, d);
        S1(i,:)=simplebounds(S1(i,:),Lb,Ub);
    end

    Fitness1 = zeros(1,n);

```

```
for i=1:1:n
    S2(i,:) = randsample(ind_cont, d);
    S2(i,:)=simplebounds(S2(i,:),Lb,Ub);
end

Fitness2 = zeros(1,n);
Fitness3 = zeros(1,n);

if rand>p

    for i=1:1:n
        L=Levy(d);
        dS=L.*(Sol(i,:)-best);
        S1(i,:)=Sol(i,:)+dS;
        S1(i,:)=simplebounds(S1(i,:),Lb,Ub);
        Fitness1(i)=Fun(S1(i,:));
    end

else
    %%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%

    for i=1:1:pop
        Sol(i,:);
        Fitness(i)=Fun(Sol(i,:));
    end

    [Fitness, indf] = sort(Fitness, 'descend');

    clone = Sol(indf(1:m),:);
    clear indf

    clone_pop = zeros(n,d);
    for i=1:1:18
        clone_pop(i,:)=clone(1,:);
    end
    for i=19:1:34
        clone_pop(i,:)=clone(2,:);
    end
    for i=35:1:48
        clone_pop(i,:)=clone(3,:);
    end
    for i=49:1:60
        clone_pop(i,:)=clone(4,:);
    end
    for i=61:1:70
        clone_pop(i,:)=clone(5,:);
    end
    for i=71:1:78
        clone_pop(i,:)=clone(6,:);
    end
    for i=79:1:84
        clone_pop(i,:)=clone(7,:);
    end
end
```



```
end
for i=85:1:88
    clone_pop(i,:)=clone(8,:);
end
for i=89:1:90
    clone_pop(i,:)=clone(9,:);
end
for i=91:1:92
    clone_pop(i,:)=clone(10,:);
end
for i=93:1:94
    clone_pop(i,:)=clone(11,:);
end
for i=95:1:96
    clone_pop(i,:)=clone(12,:);
end
for i=97:1:98
    clone_pop(i,:)=clone(13,:);
end
for i=99:1:100
    clone_pop(i,:)=clone(14,:);
end
%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
clone_pop;

for j=1:1:n
    epsilon=rand;
    JK=randperm(n);
    S2(j,:)=clone_pop(j,:)+ (3*epsilon*(Sol(JK(1),:)-Sol(JK(2),:)));
    S2(j,:)=simplebounds(S2(j,:),Lb,Ub);
    Fitness2(j)=Fun(S2(j,:));
end

end

S3 = [Sol; S1; S2];
size(S3);

for k=1:1:length(S3)
    Fitness3(k)=Fun(S3(k,:));
end

[Fitness3, ind3] = sort(Fitness3, 'descend');
best_S3 = S3(ind3(1:end),:);
clear ind3

size(best_S3);
Sol_lev_clon = [best_S3 Fitness3'];
size(Sol_lev_clon);
Sol=best_S3(1:n,:);

best_1=Sol(1,:);
```

```

if Sol_lev_clon(1,end)>fmax
    best=best_1;
end

bestSol=pind(best);
model.rxns(bestSol)

fmax_gen(gen+1)=Sol_lev_clon(1,end);

%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%% META-DYNAMIC STEP %%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%

if round(gen)==gen
    temp=best;
    bestu=[bestu; temp fmax_gen(end)];
    clear temp
    if gen>0
        sz_bestu=size(bestu);
        k_1=bestu((sz_bestu(1)-1),end);
        k_2=bestu(sz_bestu(1),end);
        Toler = k_1-k_2
        if Toler >= 0
            for i=1:1:pop
                Sol(i,:)=randsample(ind_cont,d);
                Sol(i,:)=simplebounds(Sol(i,:),Lb,Ub);
            end
        end
    end

end

end

%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%% META-DYNAMICS STEP ENDS%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%

gen= gen+1;
end

[~,idx]=unique(Sol_lev_clon,'rows');
half_tmp=Sol_lev_clon(sort(idx),:);
half_tmp=half_tmp(1:20,:);

half =[half; half_tmp];
clear half_tmp

fmax_gen=fmax_gen';
fmax = fmax_gen(end,1);
bestu;
bestSol=pind(best);
model.rxns(bestSol);
section = section+1
clear Fitness Sol bestu best

if (0 < section)&& (section<sectionmax)
    gen=0;
end

```

end

final\_pop=half;

net\_out=final\_pop(:,1:(end-1));

net\_out=unique(net\_out);

net\_out=pind(net\_out);

net\_out=net\_out';

reduced\_section = net\_out;

xlswrite('C:\Users\...\MATLAB\cobra\FOCuS\acetate\_iter1.xlsx', reduced\_section)

toc

end

function s=simplebounds(s,Lb,Ub)

global bound\_cont

global d

ns\_tmp=s;

I=ns\_tmp<Lb;

ns\_tmp(I)=Lb(I);

J=ns\_tmp>Ub;

ns\_tmp(J)=Ub(J);

s=ns\_tmp;

s=round(s);

s\_1=unique(s);

len = length(s\_1);

if len == (d-1)

    s\_2 = setdiff(bound\_cont, s\_1);

    s\_3 = randsample(s\_2,1);

    s = [s\_1 s\_3];

end

if len == (d-2)

    s\_2 = setdiff(bound\_cont, s\_1);

    s\_3 = randsample(s\_2,2);

    s = [s\_1 s\_3];

end

if len == (d-3)

    s\_2 = setdiff(bound\_cont, s\_1);

    s\_3 = randsample(s\_2,3);

    s = [s\_1 s\_3];

end

end

%%%

```
function L =Levy(d)
beta=3/2;
tmpdiv=(gamma((1+beta)/2)*beta*2^((beta-1)/2))^(1/beta);
sigma = (gamma(1+beta)*sin(pi*beta/2))/tmpdiv;
u=randn(1,d)*sigma;
v=randn(1,d);
step=u./abs(v).^(1/beta);
L=0.01*step;
end
```

```
function fun_eval = Fun(p1)
```

```
global model
global pind
global rxn_max
```

```
p2=pind(p1);
deletions = model.rxns(p2);
```

```
nDel = length(deletions);
model_KO = model;
targetRxn=rxn_max;
toler = 1e-7;
```

```
for i = 1:nDel
    model_KO = changeRxnBounds(model_KO,deletions{i},0,'b');
end
```

```
AfterKO = optimizeCbModel(model_KO);
growthRate = AfterKO.f;
```

```
if (AfterKO.stat == 1)
    round_off = floor(AfterKO.f/toler)*toler;
    model_KO = changeRxnBounds(model_KO,model_KO.rxns(model_KO.c==1),round_off,'l');
    model_KO = changeObjective(model_KO,targetRxn);
    Max_Sol = optimizeCbModel(model_KO,'max');
    Min_Sol = optimizeCbModel(model_KO,'min');
    Prod_Max = Max_Sol.f;
    Prod_Min = Min_Sol.f;
```

```
else
    Prod_Max = 0;
    Prod_Min = 0;
end
```

```
fun_eval=Prod_Max;
```

```
clear model_KO Max_Sol Min_Sol AfterKO p1 p2 growthRate targxnind
end
```

