# Interfacing COBRA and CellNetAnalyzer

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Reviewers:

#### INTRODUCTION

CellNetAnalyzer (CNA) is a MATLAB toolbox for exploring structural and functional properties of metabolic, signaling, and regulatory networks. Metabolic networks can be analyzed with stoichiometric and constraint-based modeling techniques, including flux balance analysis (FBA), metabolic flux analysis, elementary-modes analysis, computational strain design (based on minimal cut sets) and others. Signal transduction and (gene) regulatory networks are represented and analyzed as logical networks or interaction graphs but will not be considered herein. CNA can be used either via graphical user interface (GUI) or from command line via an application programming interface (API). In the following we will focus on CNA's API functions for constrained based modeling of metabolic networks which can easily be interfaced with the COBRA toolbox.

CNA and the COBRA toolbox have some overlap in their functionality for constraint-based modeling of metabolic networks (e.g., FBA, FVA, etc), however, each tool provides also methods not supported by the other. For example, unique functions of CNA are related to metabolic pathways analysis (calculation of elementary flux modes, elementary flux vectors, convex basis) and computational strain/network design via minimal cut sets. Here we will show how a COBRA model can be converted to a CNA model which can then be analyzed with CNA's API functions.

CNA can be downloaded at <a href="http://www.mpi-magdeburg.mpg.de/projects/cna/cna.html">http://www.mpi-magdeburg.mpg.de/projects/cna/cna.html</a>. Follow the instructions for installation and path settings as described in the manual which is distributed along with the software package. An online version of the manual as well as a tutorial can also be found at the CNA web site given above (see links at the end of this document).

In general, interfacing COBRA and CNA is rather simple as they both run under MATLAB and use partially similar model structures. If you have a COBRA model and you would like to use a function of CNA you first have to convert your COBRA model to a CNA model before you can apply API functions of CNA.

#### **MATERIALS**

- Please ensure that the COBRA Toolbox has been properly installed and initialised.
- Also, you should install CNA (CellNetAnalyzer) software and initialise it. CNA web site (with manual): https://www2.mpi-magdeburg.mpg.de/projects/cna/cna.html

### **EQUIPMENT SETUP**

Requirements for using CellNetAnalyzer are:

• MATLAB Version 7.5 (Release 18) or higher.

- some functions require an LP or (M)ILP solver; CNA supports the optimization toolbox of MATLAB, GLPKMEX, and CPLEX).
- More information can be found on: https://www2.mpi-magdeburg.mpg.de/projects/cna/cna.html where also a how-to tutorial on CellNetAnalyzer is provided.

#### **PROCEDURE**

Before you start with CNA *codes*, you should initialise *the* COBRA Toolbox and CNA software by the following commands

```
initCobraToolbox;
```

```
% Add path to Cell Net Analyzer
CNAPath = '~/work/CellNetAnalyzer';
addpath(genpath(CNAPath));
startcna(1)

% Define the COBRA model
global CBTDIR
addpath([CBTDIR filesep 'tutorials' filesep 'additionalTutorials' filesep 'pathVectors'])
load('tutorial_COBRAmodel.mat')% a simple MATLAB struct with fields defined in the Documentati
% Define the directory (the place that CNA model will be saved there)
directory = 'Pathwaysvector';
```

## Converting a COBRA model to a CNA model

The next step is the conversion of the COBRA model 'tutorial\_COBRAmodel' to a CNA model (project) "cnap" which is achieved by the CNA function "cobra2cna":

```
cnap = CNAcobra2cna(tutorial_COBRAmodel);

Field 'type' not defined. Initialized with '1' (for mass-flow).
Field 'nums' not defined. Initialized with 6.
Field 'numr' not defined. Initialized with 10.
Field 'specNotes' not defined. Initialized empty 'specNotes'.
Field 'specExternal' not defined. Initialized with zero vector (i.e. all species are configured as interfield 'reacNotes' not defined. Initialized empty 'reacNotes'.
Field 'reacVariance' not defined. Initialized for all reactions a variance level of 0.01.
Field 'reacDefault' not defined. Initialized with NaN vector (empty default values).
Field 'mue' not defined. Initialized according to existence of string 'mue' in 'reacID'.
Field 'reacBoxes' not defined. Initialized with default values.
Field 'macroComposition' not defined. Initialized as empty matrix (no macromolecules defined; other field 'epsilon' not defined. Initialized with 'le-10'.
Field 'has_gui' not defined. Initialized with 'false'.
```

That's all. With the CNA project variable 'cnap' you can now call the API functions of CNA.

```
Most fields of the COBRA model have an associated field in the CNA model (e.g. S -> stoichMat; lb -> reacMin; ub->reacMax, rxns->reacID, mets -> specID; metNames -> specLongName etc.)
```

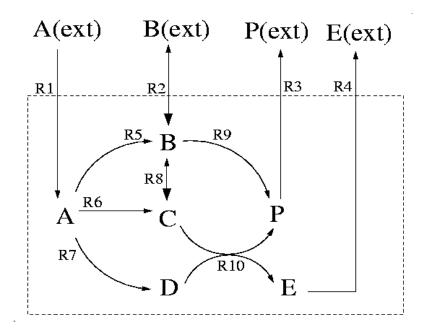
### Relevant API functions of CNA

Here is a list of most relevant CNA functions for stoichiometric and constraint-based network analysis (the complete set of CNA's API functions can be found in the directory ../CellNetAnalyzer/code/api and a detailed description is given in the CNA manual):

- **CNAcomputeEFM:** Computes elementary (flux) modes (or, alternatively, a convex basis or elementary flux vectors) from a metabolic network model.
- **CNAcomputeCutsets:** Computes minimal cut sets from given sets of target modes and protected modes.
- **CNAMCSEnumerator:** Computes minimal cut sets via the "dual approach" directly from the network (elementary modes are not needed; can deal with genome-scale networks). See ref [3].
- **CNAregMCSEnumerator:** Similar to CNAMCSEnumerator, computes minimal cut sets via the "dual approach" directly from the network. As an additional feature, up- and downregulation of fluxes is allowed as additional intervention to cuts (knockouts) then yielding *regulatory cut sets* (see ref [4]).
- **CNAgeneMCSEnumerator:** Computes minimal cut sets via the "dual approach" directly from the network similar to CNAMCSEnumerator. But here, true "gene cut sets" (instead of "reaction cut sets) can be calculated (for this purpose, gene-enzyme-reaction associations must be provided).
- **CNAfindRegMCS**: Computes minimal (regulatory) cut sets via the "dual approach" directly from the network similar to CNAregMCSEnumerator. But here only a single cut set is calculated (no enumeration).
- CNAfluxVariability: Flux variability analysis.
- **CNAoptimizeFlux:** Flux balance analysis (optimization of fluxes with respect to a linear objective function).
- **CNAoptimizeYield:** Calculates a yield-optimal flux vector maximizing a given yield function (uses linear-fractional programming).
- **CNAplotPhasePlane:** Calculates and plots phase planes (or production envelops).
- **CNAplotYieldSpace**: Calculates and plots yield spaces.
- CNAapplyCASOP: Applies the CASOP strain design method (see ref [1]).
- **CNAremoveConsRel:** Detects and helps to remove conservation relations from the network (useful for certain calculations).
- **CNAcompressMFNetwork:** Loss-free compression of a stoichiometric network to a smaller one yielding, for example, the same set of elementary modes.
- **CNAreduceMFNetwork:** Reduction of network to a smaller subnetwork where specified protected functions are maintained (see ref [2]).
- CNAcna2cobra: Converts a (mass-flow) CNA model to a COBRA model.
- CNAcobra2cna: Converts a COBRA model to a CNA (mass-flow) model.

### Example: calculating elementary flux modes of a COBRA model with CellNetAnalyzer

Here we show an example how to calculate elementary flux modes (EFMs) for a COBRA model using an API function of CNA. The metabolic network of tutorial\_COBRAmodel with 10 metabolite (6 internal and four external) and 10 reactions (6 internal and four exchange) looks as follows:



The API function of CNA to calculate elementary flux modes (or, alternatively, elementary flux vectors or convex basis vectors; for a general introduction see [5]) is CNAcomputeEFM.

### Input

Based on computing computing elementary modes and extreme pathways, the inputs can be different. You can see the optional inputs by the command

### help CNAcomputeEFM

CellNetAnalyzer API function 'CNAcomputeEFM'

- --> Computes elementary (flux) modes / elementary (flux) vectors or a minimal generating set (convex basis) of flux cones or flux polyhedra associated with mass-flow networks.

  Two different scenarios can be considered:
  - (i) In the homogeneous case, the solution space defined by the steady state assumption and reversibility constraints form a polyhedral (flux) cone. Here, elementary modes can be computed which are particular flux vectors of this cone with minimal support (= irreducible set of reactions with non-zero rate).

    The set of elementary modes includes all extreme rays of the flux cone, but usally many more (support-minimal) vectors. CNAcomputeEFM can also compute a convex basis of the flux cone In contrast to elementary modes, the convex basis is a minimal set of vectors sufficient to generate all flux vectors within the flux cone by non-negative linear combinations of convex basis vactors. As implemented herein, the convex basis will always represent a subset of the elementary modes. Note that the convex basis is only unique if there is no reversible flux vector.
  - (ii) Specifying inhomogeneous constraints (e.g., fixing a reaction rate to a non-zero value or introducing non-zero upper and/or lower boundaries for the reaction rates) leads to the inhomogeneous case where the solution space becomes a more general flux polyhedron. CNAcomputeEFM computes then either the elementary vectors of the flux polyhedron (a generalization of elementary modes; the set of elementary vectors will, for example, include all extreme rays and extreme points (if existent) of the resulting solution space). Again, alternatively, a convex basis (= minimal set of generators spanning the resulting flux polyhedron) of the flux polyhedron can also be calculated. Note that the zero point will not be delivered, even if it is an extreme point of the flux polyhedron.

Usage: [efm,irrev,idx,ray,efv\_with\_zero] = CNAcomputeEFM(cnap, constraints,...
solver, irrev\_flag, convbasis\_flag, iso\_flag, c\_macro, display, efmtool\_options)

cnap is a CellNetAnalyzer (mass-flow) project variable and mandatory argument.

All other arguments are optional:

- constraints: is either empty (=default) or a column vector or a struct specifying (homogeneous or inhomogeneous) constraints to be added to the standard (steady state and reversibility) constraints of the flux cone.
  - If constraints is a COLUMN vector it must have dimension (cnap.numr x 1) and specifies excluded/enforced reactions: if(constraints(i)==0) then only those elementary modes/vectors will be computed that do not include reaction i. If constraints(i)~=0 and constraints(i)~=NaN then reaction i is enforced, i.e. only those elementary modes / vectors will be computed that involve reaction i (with a non-zero rate). For all other reactions choose constraint(i)=NaN. Several reactions may be suppressed/enforced simultaneously

If constraints is a struct it may contain the following fields (all optional):

- constraints.reaconoff: a column vector with dimension (cnap.numr x 1) which specifies excluded/enforced reactions: if(constraints.reaconoff)==0) then only those elementary modes/vectors will be computed that do not include reaction i; if constraints.reaconoff(i)~=0 and constraints.reaconoff(i)~=NaN then reaction i is enforced, i.e. only those elementary modes / vectors will be computed that involve reaction i (with a non-zero rate); for all other reactions choose constraint(i)=NaN. Several reactions may be suppressed/enforced simultaneously.
- constraints.lb: a column vector with dimension (cnap.numr x 1) which specifies lower boundaries for the reaction rates (choose constraints.lb(i)=NaN if there is no lower bound). Note that a lower bound of zero (irreversibilities) set in cnap.reacMin will be considered in any case and need not be specified via constraints.lb (but note that no other bound of cnap.reacMin will be considered!).
- constraints.ub: a column vector with dimension (cnap.numr x 1) which specifies upper boundaries for the reaction rates (choose constraints.ub(i)=NaN if there is no upper bound). Note that no upper bound possibly defined in cnap.reacMax will be considered!.
- constraints.eqto: a column vector with dimension (cnap.numr x 1) which specifies equalities constraints for the reaction rates (choose constraints.eqto(i) NaN if none is active for reaction i).
- constraints.A (an h x cnap.numr matrix) and constraints.b (an h x 1 column vector) specify inequalities of the type A\*r<=b (r: flux vector of the network). Note that constraints.lb, constraints.ub and constraints.eqto could also be formulated via constraints.A and constrainbts.b.

One should be careful to not define inconsistent constraints, such as constraints.lb=3 and constraints.ub=2. Again note that cnap.reacMin and cnap.reacMax will not be considered for inhomogeneous constraints (cnap.reacMin is only used for marking reaction reversible (cnap.reacMax and irreversible). However, you could, easily enforce those constraints by setting constraints.lb=cnap.reacMin and constraints.ub=cnap.reacMax (Inf and 0 values in constraints(:2,) and constraints(:,3) should afterwards be set to NaN as they represent homogeneous constraints).

If columns constraints.lb, constraints.ub, constraints.eqto and constraints.A / constraints.b are not specified or contain only zeros/NaN then elementary modes (if convbasis\_flag=0; see below or minimal generating sets (if convbasis\_flag=1) of the flux cone will be computed (homogeneous problem). Any non-zero non-NaN value in in these vectors/matrix renders the problem inhomogeneous and the solution space to be a (flux) polyhedron. This function will then compute the elementary vectors of the flux polyhedron (if convbasis\_flag=0) OR, again (if convbasis\_flag=0), only a minimal set of unbounded and bounded generators spanning the resulting flux polyhedron. The returned vector 'ray' indicates whether the i-th vector in 'efm' is unbounded (ray(i)==1) or bounded (e.g. an extreme point; ray(i)==0) (see also below). In case of the flux cone (elementary modes) they are always unbounded. The returned vector 'irrev' indicates whether an elementary mode/vector is reversible or not (see below).

solver: [0|1|3|4] 0: pure Matlab CNA function; 1: CNA mex files; 3: Metatool mex files;
 4: Marco Terzer's EFMtool (see http://www.csb.ethz.ch/tools/index).
 Default:4.

Note that EFMtool cannot be used if some reactions are enforced (see constraints) and it cannot be used for calculating the convex basis.

irrev\_flag: [0|1] whether (1) or not (0) to consider reversibilities of reactions 0: all reactions are reversible (default: 1)

```
convbasis flag: [0|1] whether only a minimal generating set (convex basis) [1] is to be calculated
      or all elementary modes/vectors [0]. Default: 0.
  iso flag: [0|1] whether parallel reactions should be considered only once (default: 0)
  c macro: vector containing the concentrations (g/gDW) of the macromolecules
      if a variable biomass composition has been defined (cnap.mue not empty).
      Can be empty when cnap.mue or cnap.macroComposition is empty. If it
      is empty and cnap.mue is not empty then cnap.macroDefault is used.
      (default: cnap.macroDefault)
  display: controls the detail of console output; choose one of
      {'None', 'Iteration', 'All', 'Details'}
      default: 'All'
  efmtool options: cell array with input for the CreateFluxModeOpts function.
      Default: {} (some options will be set by default; cf. console output for the actual options used
The following results are returned:
  efm: matrix that contains (row-wise) the elementary modes (or elemenatry vectors) or a minimal set of
      generators depending on the chosen scenario. The columns correspond to the reactions; the column
      indices of efms (with respect to the columns in cnap.stoichMat) are stored in the returned varia
      idx (see below; note that columns are removed in efms if the corresponding reactions are not
      contained in any mode)
  irrev: vector indicating for each elementary mode/vector whether it is reversible (0)/irreversible (0)
  idx: maps the columns in efm onto the column indices in cnap.stoichmat,
   i.e. idx(i) refers to the column number in cnap.stoichmat (and to
   the row number in cnap.reacID)
  ray: indicates whether the i-th row (vector) in efm is an unbounded (1) or bounded (0) direction
      of the flux cone / flux polyhedron. Bounded directions (such as extreme points) can only arise
      if an inhomogeneous problem was defined (see also above for 'constraints').
```

So there are quite a number of different options and arguments. For example, CNAsolver can be 0, 1, 3 or 4, which

- 0: pure Matlab CNA function;
- 1: CNA mex files;
- 3: Metatool mex files;
- 4: Marco Terzer's EFMtool (see http://www.csb.ethz.ch/tools/index).

The Default is 4. Note that EFMtool cannot be used if some reactions are enforced (see constraints) and it cannot be used for calculating the convex basis.

However, for a standard calculation of elementary flux modes you just need to call the function with the CNA model (project) variable (which enforces default parameter setting). Hence, enter:

```
[efm,rev,idx,ray,efv with zero] = CNAcomputeEFM(cnap)
```

```
Network compression ...

Can't load log handler "ch.javasoft.util.logging.StandardOutHandler"
java.lang.ClassNotFoundException: ch.javasoft.util.logging.StandardOutHandler
java.lang.ClassNotFoundException: ch.javasoft.util.logging.StandardOutHandler
```

```
at java.net.URLClassLoader$1.run(URLClassLoader.java:366)
 at java.net.URLClassLoader$1.run(URLClassLoader.java:355)
 at java.security.AccessController.doPrivileged(Native Method)
 at java.net.URLClassLoader.findClass(URLClassLoader.java:354)
 at java.lang.ClassLoader.loadClass(ClassLoader.java:425)
 at sun.misc.Launcher$AppClassLoader.loadClass(Launcher.java:308)
 at java.lang.ClassLoader.loadClass(ClassLoader.java:358)
 at java.util.logging.LogManager$4.run(LogManager.java:808)
 at java.security.AccessController.doPrivileged(Native Method)
 at java.util.logging.LogManager.loadLoggerHandlers(LogManager.java:802)
 at java.util.logging.LogManager.initializeGlobalHandlers(LogManager.java:1406)
 at java.util.logging.LogManager.access$1500(LogManager.java:148)
 at java.util.logging.LogManager$RootLogger.accessCheckedHandlers(LogManager.java:1493)
 at java.util.logging.Logger.getHandlers(Logger.java:1350)
 at java.util.logging.Logger.log(Logger.java:612)
 at java.util.logging.Logger.doLog(Logger.java:641)
 at java.util.logging.Logger.log(Logger.java:664)
 at ch.javasoft.metabolic.compress.CompressionMethod.logUnsupported(CompressionMethod.java:125)
 at ch.javasoft.metabolic.compress.StoichMatrixCompressor.<init>(StoichMatrixCompressor.java:92)
Can't load log handler "ch.javasoft.util.logging.StandardErrHandler"
java.lang.ClassNotFoundException: ch.javasoft.util.logging.StandardErrHandler
java.lang.ClassNotFoundException: ch.javasoft.util.logging.StandardErrHandler
 at java.net.URLClassLoader$1.run(URLClassLoader.java:366)
 at java.net.URLClassLoader$1.run(URLClassLoader.java:355)
 at java.security.AccessController.doPrivileged(Native Method)
 at java.net.URLClassLoader.findClass(URLClassLoader.java:354)
 at java.lang.ClassLoader.loadClass(ClassLoader.java:425)
 at sun.misc.Launcher$AppClassLoader.loadClass(Launcher.java:308)
 at java.lang.ClassLoader.loadClass(ClassLoader.java:358)
 at java.util.logging.LogManager$4.run(LogManager.java:808)
 at java.security.AccessController.doPrivileged(Native Method)
 at java.util.logging.LogManager.loadLoggerHandlers(LogManager.java:802)
 at java.util.logging.LogManager.initializeGlobalHandlers(LogManager.java:1406)
 at java.util.logging.LogManager.access$1500(LogManager.java:148)
 at java.util.logging.LogManager$RootLogger.accessCheckedHandlers(LogManager.java:1493)
 at java.util.logging.Logger.getHandlers(Logger.java:1350)
 at java.util.logging.Logger.log(Logger.java:612)
 at java.util.logging.Logger.doLog(Logger.java:641)
 at java.util.logging.Logger.log(Logger.java:664)
 at ch.javasoft.metabolic.compress.CompressionMethod.logUnsupported(CompressionMethod.java:125)
 at ch.javasoft.metabolic.compress.StoichMatrixCompressor.<init>(StoichMatrixCompressor.java:92)
Matrix size before network compression: 6 10
Matrix size after network compression: 2 6
Using 'CalculateFluxModes'
//Applications/MATLAB R2016b.app/sys/java/jre/maci64/jre/bin/java' -Xms1024m -Xmx1024m -XX:+UseParallel
2017-12-20 15:34:34.758 main
                                                   INF0
2017-12-20 15:34:34.761 main
                                                   INF0
                                                              efmtool version 4.7.1, 2009-12-04 18:30:05
2017-12-20 15:34:34.761 main
                                                   INF<sub>0</sub>
                                                              Copyright (c) 2009, Marco Terzer, Zurich,
2017-12-20 15:34:34.761 main
                                                   INF0
                                                              This is free software, !!! NO WARRANTY !!
2017-12-20 15:34:34.761 main
                                                   INF0
                                                              See LICENCE.txt for redistribution conditi
2017-12-20 15:34:34.762 main
                                                   INF0
                                                              _____
2017-12-20 15:34:35.316 main
                                  efm.output.mat
                                                   INF0
                                                              estimated efms-per-file: 44000000
2017-12-20 15:34:35.346 main
                                  efm.impl
                                                   INF<sub>0</sub>
                                                              Elemetary flux mode computation
2017-12-20 15:34:35.347 main
                                  efm.impl
                                                   INF<sub>0</sub>
                                                              Implementation:
2017-12-20 15:34:35.349 main
                                  efm.impl
                                                   INF0
                                                              ..algorithm name
                                                                                 : SequentialDoubleDesc
```

```
2017-12-20 15:34:35.349 main
                                efm.impl
                                                INF0
                                                           ..model type
                                                                          : NullspaceEfmModel
2017-12-20 15:34:35.350 main
                                                INF0
                                                           ..memory type
                                                                            : InCoreMemory
                                efm.impl
2017-12-20 15:34:35.350 main
                                                INF0
                                                           ..output type
                                                                             : MatFile
                                efm.impl
2017-12-20 15:34:35.350 main
                                                INF0
                                efm.impl
                                                           System:
2017-12-20 15:34:35.540 main
                                                INF0
                                                                             : bmp00191.local
                                efm.impl
                                                           ..hostname
2017-12-20 15:34:35.540 main
                                                           ..operating system : x86_64/Mac OS X/10.12
                                                INF0
                                efm.impl
2017-12-20 15:34:35.541 main
                                efm.impl
                                                INF0
                                                         | ..processors : 4
2017-12-20 15:34:35.541 main
                                efm.impl
                                                INF0
                                                                             : Oracle Corporation/Ja
                                                           ..vm
2017-12-20 15:34:35.541 main
                                efm.impl
                                                INF0
                                                         ..vm-spec
                                                                            : Oracle Corporation/Ja
```

```
2017-12-20 15:34:35.543 main
                                  efm.impl
                                                   INF0
                                                                                 : [-Xms1024m, -Xmx1024r
                                                            | ..vm arguments
2017 - 12 - 20
           15:34:35.545
                          main
                                  efm.impl
                                                   INF0
                                                              ..memory, committed: 1029M
2017-12-20 15:34:35.545
                         main
                                  efm.impl
                                                   INF0
                                                              ..memory, used
                                                                                 : 21M
2017-12-20 15:34:35.545 main
                                  efm.impl
                                                   INF0
                                                              Config:
2017-12-20 15:34:35.545 main
                                                   INF0
                                  efm.impl
                                                              ..generator
                                                                                 : Efm
2017-12-20 15:34:35.545
                         main
                                  efm.impl
                                                   INF0
                                                              ..adj method
                                                                                 : pattern-tree-minzero
2017-12-20 15:34:35.545
                         main
                                  efm.impl
                                                   INF0
                                                              ..row ordering
                                                                                 : MostZerosOrAbsLexMin
2017-12-20 15:34:35.548 main
                                  efm.impl
                                                   INF0
                                                              ..arithmetic
                                                                                 : double (prec: -1 / ze
2017-12-20 15:34:35.548
                                  efm.impl
                                                   INF0
                                                                                 : off
                         main
                                                              ..compression
                                                              ..compr. methods
2017-12-20 15:34:35.548 main
                                  efm.impl
                                                   INF0
                                                                                 : []
2017-12-20 15:34:35.549 main
                                  efm.impl
                                                   INF0
                                                              ..normalize
                                                                                  : min
2017-12-20 15:34:35.549 main
                                                              ..max threads
                                  efm.impl
                                                   INF0
                                                                                 : 4
2017-12-20 15:34:35.549 main
                                  efm.impl
                                                   INF0
                                                              ..self test
                                                                                  : off
                                  efm.impl
2017-12-20 15:34:35.549 main
                                                   INF0
                                                              ..progress type
                                                                                 : None
2017-12-20
          15:34:35.549 main
                                  efm.impl
                                                   INF0
                                                              ..progress part.
                                                                                  : 100
2017-12-20
           15:34:35.550 main
                                  efm.impl
                                                   INF0
                                                              ..suppress
                                                                                  : []
2017-12-20
                                  efm.impl
                                                                                  : []
           15:34:35.550 main
                                                   INF0
                                                              ..enforce
2017 - 12 - 20
                                                                                  : []
           15:34:35.550 main
                                  efm.impl
                                                   INF0
                                                              ..nosplit
2017-12-20
           15:34:35.551 main
                                  efm.impl
                                                   INF0
                                                              ..temp dir
                                                                                  : /Users/susan.ghaderi,
2017-12-20
           15:34:35.551 main
                                  efm.impl
                                                   INF0
                                                                                  : (none)
                                                              ..flag
2017-12-20
                                                   INF0
                                                              Distributed Config:
           15:34:35.551 main
                                  efm.impl
2017 - 12 - 20
           15:34:35.551 main
                                  efm.impl
                                                   INF0
                                                              ..node count
                                                                                 : 2
                                                                                 : [localhost, localhost
2017-12-20 15:34:35.551 main
                                  efm.impl
                                                   INF0
                                                              ..nodes
2017-12-20 15:34:35.551 main
                                  efm.impl
                                                   INF0
                                                                                 : [-Xmx800M, -Xmx500M]
                                                              ..vmargs
2017-12-20 15:34:35.551 main
                                                   INF0
                                                                                 : /usr/bin/java [vmargs
                                  efm.impl
                                                              ..command
2017-12-20 15:34:35.551 main
                                                   INF0
                                                              ..partition
                                  efm.impl
                                                                                 : 256
2017-12-20 15:34:35.552
                                                              ..cand. threshold : 100000
                                  efm.impl
                                                   INF0
                         main
2017-12-20 15:34:35.556 main
                                  efm.impl
                                                   INF0
                                                              original network: 2 metabolites, 6 reaction
2017-12-20 15:34:35.688 main
                                                   INF0
                                                              stoich expanded has dimensions 2x8
                                  efm.impl
2017-12-20 15:34:35.688 main
                                  efm.impl
                                                   INF0
                                                              kernel matrix has dimensions 8x6
2017-12-20 15:34:35.689 main
                                  efm.impl
                                                   INF0
                                                              TIME preprocessing: 354ms
2017-12-20 15:34:35.713 main
                                  efm.impl
                                                   INF0
                                                              iteration 0/2: 6 modes, dt=0ms. { next 1/2
2017-12-20 15:34:35.762 main
                                                   INF0
                                                              iteration 1/2: 7 modes, dt=49ms. { next 2,
                                  efm.impl
2017-12-20 15:34:35.776 main
                                                              iteration 2/2: 10 modes, dt=13ms.
                                  efm.impl
                                                   INF0
2017-12-20
          15:34:35.776 main
                                                   INF0
                                                              TIME iterate: 69ms
                                  efm.impl
                                                              efm count before postprocessing: 10
2017-12-20
           15:34:35.776 main
                                                   INF0
                                  efm.impl
2017-12-20
                                                              efm count after filtering/consolidation: 8
           15:34:35.779 main
                                  efm.impl
                                                   INF0
2017-12-20 15:34:35.779 main
                                                              uncompressing modes (can take a while)
                                  efm.impl
                                                   INF0
2017-12-20 15:34:35.803 main
                                                              estimated efms-per-file: 44000000
                                  efm.output.mat
                                                   INF0
2017-12-20 15:34:35.865
                         main
                                  efm.output.mat
                                                   INF0
                                                              estimated efms-per-file: 44000000
2017 - 12 - 20
           15:34:35.878
                         main
                                  efm.output.mat
                                                   INF0
                                                              estimated efms-per-file: 44000000
2017-12-20
           15:34:35.902
                                  efm.output.mat
                                                   INF0
                                                              estimated efms-per-file: 44000000
                          main
           15:34:35.943
                                                              TIME postprocessing: 167ms
2017-12-20
                                  efm.impl
                                                   INF0
                         main
2017-12-20 15:34:35.943
                                                   INF0
                         main
                                  efm.impl
                                                              overall computation time: 608ms
```

Don't forget to delete temporary files in the CellNetAnalyzer/code/ext/efmtool/tmp directory!

Final number of elementary modes: 8

```
efm =
           - 1
                                        1
                                                     - 1
     1
            0
                   1
                          0
                                 1
                                        0
                                               0
                                                      0
                                                             1
                                                                    0
     1
            0
                   1
                          0
                                 0
                                        1
                                               0
                                                                    0
                                                     - 1
                                                             1
     1
            1
                   1
                          1
                                 0
                                        0
                                               1
                                                     1
                                                             0
                                                                    1
     1
           - 1
                   0
                          0
                                 1
                                        0
                                               0
                                                      0
                                                             0
                                                                    0
     0
           1
                   1
                          0
                                 0
                                        0
                                               0
                                                      0
                                                             1
                                                                    0
     2
            0
                   1
                          1
                                 1
                                        0
                                               1
                                                      1
                                                             0
                                                                    1
     2
            0
                   1
                          1
                                 0
                                        1
                                               1
                                                      0
                                                             0
                                                                    1
```

```
rev =
1
1
1
1
1
1
1
```

```
1
1
idx =

1 2 3 4 5 6 7 8 9 10
ray =

1 1 1 1 1 1 1 1 1
efv with zero = 1
```

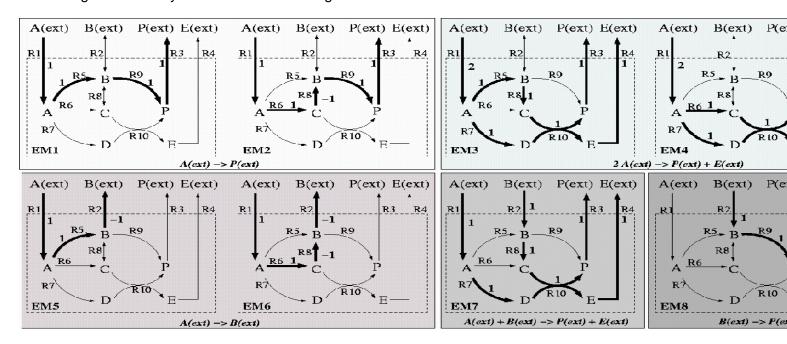
In this (standard) case, the EFMs are calculated with efmtool (without inhomogeneous constraints).

### Output

The output of pathVectors.m is

- efm: contains the elementary flux modes in the rows. The columns contain the stoichiometric coefficients of the reactions - but note that the columns do not necessarily have the same order as in the stoichiometric matrix:
- idx: maps the columns in efm onto the original columns/reactions, i.e. idx(i) maps the i-th column (reaction) in efm to the column (reaction) number in the stoichiometric matrix (cnap.stoichmat). In our example, idx exhibits a 1:1 mapping. The vector rev indicates the reversibility of the calculated modes (0: reversible; 1: irreversible; hence, in this example, all modes are irreversible);
- rev: indicates the reversibility of the calculated modes (0: reversible; 1: irreversible; hence, in this example, all modes are irreversible).
- ray: indicates which of the calculated modes is unbounded (always true for EFMs);
- efv\_with\_zero: indicates whether the zero vector is part of the solution space (always true for EFMs).

These eoght elementary modes are shown in figuers 2:



If you now want to calculate the convex basis vectors (a subset of EFMs that are sufficient to span the flux cone; e.g. useful for calculation of extreme pathways) we have to set the <code>conbasis\_flag</code> argument (the 5-th argument) to 1. We also choose now the Metatool routine for calculating the convex

basis (efmtool cannot be used for calculating convex bases). For the other arguments we chose the standard values:

```
[efm,rev,idx,ray,efv_with_zero] = CNAcomputeEFM(cnap,[],3,1,1)
```

```
Cannot use METATOOL MEX version: no executable MEX file found
Flux cone is pointed - reversible modes do not exist
Remaining metabolites: 2
Remaining reactions: 6 (4 reactions are irreversible)
column 1/2: C (6 preliminary vectors, 20-Dec-2017 15:34:36 cput: 0.04
column 2/2: B (5 preliminary vectors, 20-Dec-2017 15:34:36 cput: 0.08
4 convex basis vectors found 20-Dec-2017 15:34:36 cput: 0.09
Final number of convex basis vectors: 4
efm =
    0
    1
          - 1
                0
                      0
                            1
               1
0
    1
          1
                      1
                                        1
                                              1
                                                          1
    1
rev =
    1
    1
    1
    1
idx =
                                       7
    1
          2
                3
                                                         10
ray =
    1
          1
efv_with_zero = 1
```

# Converting a CNA model to a COBRA model

A CNA model 'cnap' can also be converted to a COBRA model by

```
cbmodel = CNAcna2cobra(cnap);
```

Removing 0 external metabolites

Then, COBRA functions can be applied to a (former) CNA model as well.

Note that if you convert a COBRA model to CNA and then back to a COBRA model, some model information can be lost since a CNA model does not capture all (potential) fields of a COBRA model. The following fields will definitely be maintained when converting a COBRA model to a CNA model and back:

cbmodel.rxns

- cbmodel.mets
- cbmodel.S
- cbmodel.lb
- cbmodel.ub
- cbmodel.rev
- cbmodel.c
- · cbmodel.b
- cbmodel.metNames

### References

- [1] Hädicke O and Klamt S. (2010) CASOP: A Computational Approach for Strain Optimization aiming at high Productivity. **Journal of Biotechnology**, 147, 88-101.
- [2] Erdrich P, Steuer R, Klamt S. (2015) An algorithm for the reduction of genome-scale metabolic network models to meaningful core models. **BMC Systems Biology** 9:48.
- [3] von Kamp A, Klamt S (2014) Enumeration of smallest intervention strategies in genome-scale metabolic networks. **PLoS Computational Biology**, 10:e1003378.
- [4] Mahadevan R, von Kamp A, Klamt S. (2015) Genome-scale strain designs based on regulatory minimal cut sets. **Bioinformatics** 31:2844-2851.
- [5] Klamt S, Regensburger G, Gerstl MP, Jungreuthmayer C, Schuster S, Mahadevan R, Zanghellini J, Müller S. (2017) From elementary flux modes to elementary flux vectors: Metabolic pathway analysis with arbitrary linear flux constraints. **PLoS Comput Biol** 13:e1005409.