# Constraint-based Modeling of Cellular Networks

Exercise 13 – EFM

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# Identifying EFMs

• Find the maximal number of reactions that can have a 0 flux while the remaining active reactions still satisfy the steady state constrain

# Identifying EFMs

Find the maximal number of reactions that can have a 0 flux while the remaining active reactions still satisfy the steady state constrain

Step 1: Split reversible reactions into two irreversible

Step 2: Introduce binary variable  $y_i$  for each reaction in the network such that

If 
$$y_i = 0 \Leftrightarrow v_i = 0$$
  
If  $y_i = 1 \Leftrightarrow \varepsilon \le v_i \le v_i^{max}$ 

Next: Write the appropriate objective function

#### The LP

$$\min \sum y_{i}$$
s.t.
$$Nv = 0$$

$$v_{i} \leq y_{i}v_{i}^{max}$$

$$y_{i} \epsilon \leq v_{i}$$

$$y_{i} \in \{0,1\}$$

Next: Add a constraint that exclude trivial solution (no reaction carrying flux)

### The LP

$$\min \sum y_{i}$$
s.t.
$$Nv = 0$$

$$v_{i} \le y_{i}v_{i}^{max}$$

$$y_{i}\varepsilon \le v_{i}$$

$$y_{i} \in \{0,1\}$$

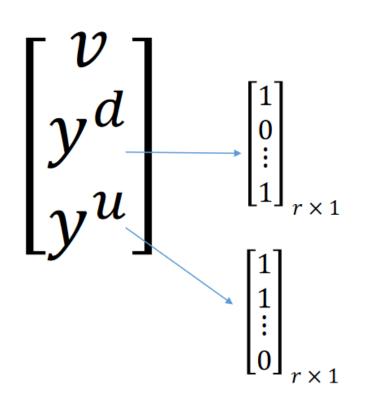
$$\sum y \le 1$$

Next: Enforce directionality of reverse reactions

## The LP

$$\min \sum y_i$$
 s.t. 
$$\begin{aligned} Nv &= 0 \\ v_i \leq y_i v_i^{max} \\ y_i \varepsilon \leq v_i \\ y_i \in \{0,1\} \\ \sum y \leq 1 \end{aligned}$$
 For paired reactions  $R_j$   $y_{jFw} + y_{jBw} \leq 1$ 

## Alternative Solution – integer cut



(1) Find zeros from these two vectors (e.g. using find (...))

For instance: 
$$y_2^d = y_{12}^d = y_{25}^d = y_{51}^d = y_3^u = y_{10}^u = y_r^u = 0$$

Take into account that there is integer tolerance options. IntegerTolerance

(2) Add an additional constraint:

$$y_2^d + y_{12}^d + y_{25}^d + y_{51}^d + y_3^u + y_{10}^u + y_r^u \ge 1$$
 (at least one of them must be equal to one)

How to modify if  $y_i = 1$  means that a reaction is in the previous solution?