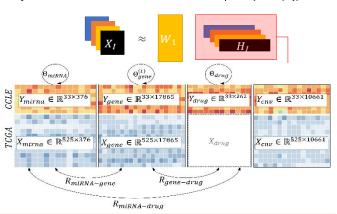
*NMF* does not solve the integration problem, joint Non-negative Matrix Factorization (*jNMF*) does.

$$\min_{W, H_I} \sum_{I} ||X_I - WH_I||_F^2 \quad s. \, t. \, W \ge 0, H_I \ge 0$$

jNMF is an extension of NMF for multiple inputs  $(X_I)$ 



## 1. Multidimensional-jNMF

$$\begin{aligned} & \min \ F(W_{1}, W_{2}, H_{1}, \dots, H_{I}) = \\ & \|X_{I} - W_{1} H_{I}\|_{F}^{2} + \|Y_{I} - W_{2} H_{I}\|_{F}^{2} + \|Y_{drug} - W_{2} H_{drug}\|_{F}^{2} \\ & -\lambda_{1} \sum_{I} \sum_{t} Tr\left(H_{I} \Theta_{I}^{(t)} H_{I}^{T}\right) - \lambda_{2} \sum_{I \neq J} Tr(H_{I} R_{IJ} H_{J}^{T}) \\ & + \gamma_{1} \|W_{1}\|_{F}^{2} + \gamma_{2} \|W_{2}\|_{F}^{2} + \delta_{1} \left(\sum_{I} \sum_{j} \|h_{J}^{I}\|_{1}^{2}\right) \end{aligned}$$

Prior knowledge

EXP

STRING

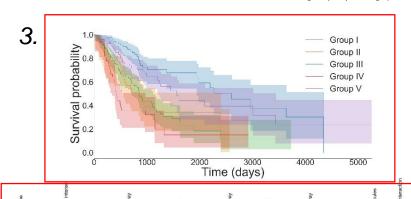
BIOGRID

PRUGBANK

Obs

THE CANCER CENOME ATLAS
NITH Medicinal fourcer utilitide
National cancer utilitide

\* Co-Modules \*\* Cluster Patient-Cell Lines \*\*\* Drug repurposing (AUC)



## Multi-omic data integration using joint Non-negative Matrix Factorization approaches for identification of relevant biological events in low-grade glioma

- Low-grade glioma is a brain cancer with heterogeneous behavior
- 1. We implemented a variant of joint matrix factorization (MjNMF)
- 2. We used observational (TCGA) and experimental data (CCLE)
- **3.** Clusters of patients have different <u>survival characteristics</u> and <u>gene</u> <u>signatures</u>
- 4. Association patients-cell lines showed similar biological pathways
- **5.** We identified miRNA signatures for patients with low and high sensitivity to drugs

