





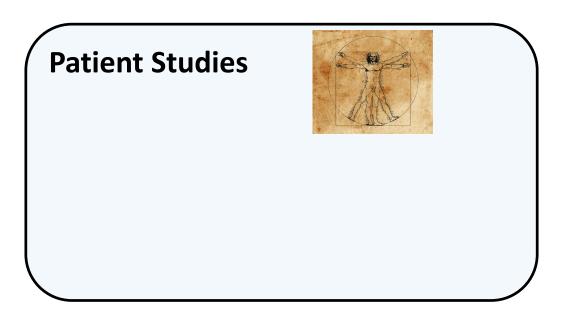
The *AMARETTO framework: a regulatory network inference tool for multi-omics & imaging data fusion across systems and diseases

Nathalie Pochet, Ph.D. (npochet@broadinstitute.org)

Demo: Mohsen Nabian, Ph.D. (mnabian@broadinstitute.org)

Harvard Medical School, Brigham and Women's Hospital, Broad Institute of MIT and Harvard

Big Data in Biomedicine: Big Data Modeling in Human Diseases



Patient Studies



Decipher disease heterogeneity

Multi-omics: (epi)genetics & functional genomics Driver discovery via regulatory network inference

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Multi-omics: (epi)genetics & functional genomics Driver discovery via regulatory network inference

Bulk & single-cell multi-omics
Non-invasive & histopathology imaging

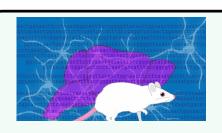
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Model Systems

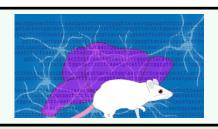
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Model Systems

Perturbation studies

Genetic perturbations for driver discovery Chemical perturbations for drug discovery

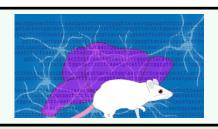
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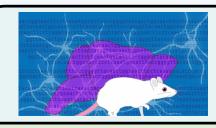
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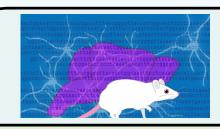
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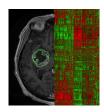
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Disease (sub)typing

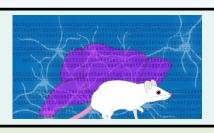
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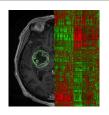
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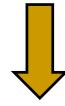
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Disease (sub)typing





Driver discovery

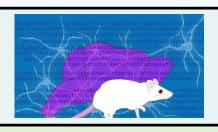
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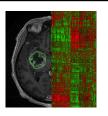
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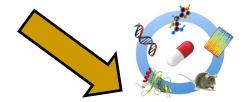
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Driver discovery





Drug discovery

Disease (sub)typing

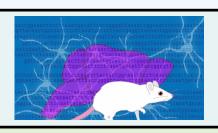
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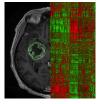
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Disease (sub)typing

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Drug discovery

Large publicly available archives provide us with complementary views of human disease.





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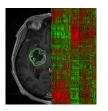
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Disease (sub)typing





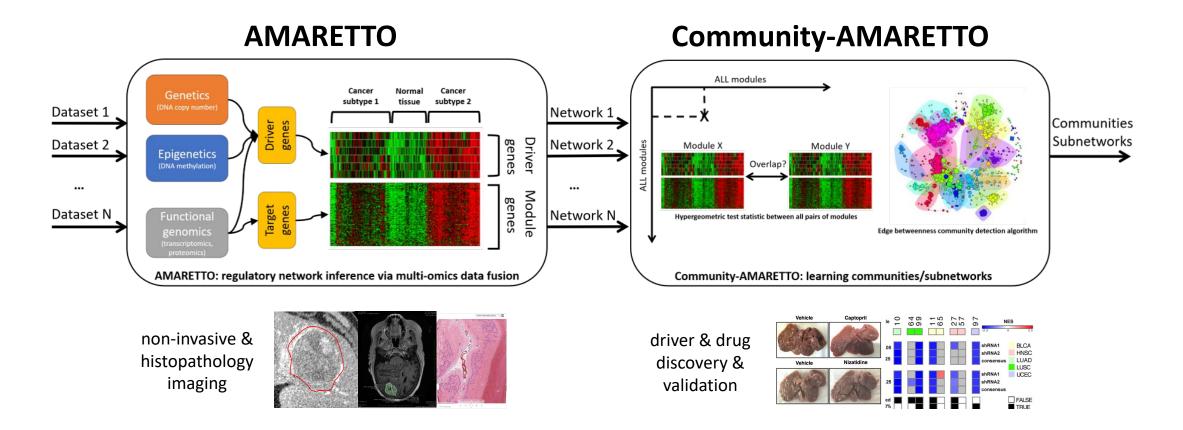


Driver discovery

Drug discovery

Large publicly available archives provide us with <u>complementary views</u> of human disease. Can we learn more powerful models by translating knowledge across different domains?

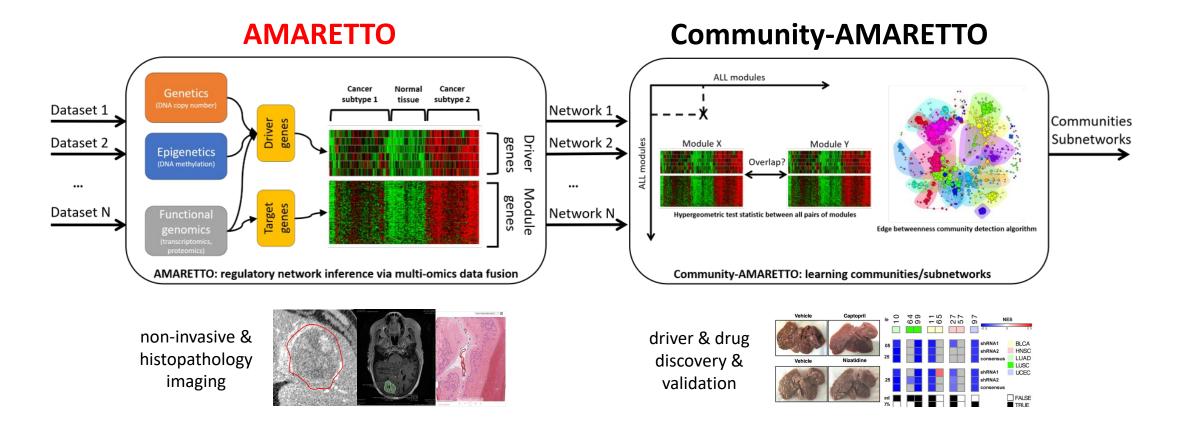
The *AMARETTO framework



The *AMARETTO framework:

- 1. the AMARETTO algorithm for inferring regulatory networks via multi-omics and imaging data fusion
- 2. the Community-AMARETTO algorithm for learning subnetworks shared/distinct across systems and diseases

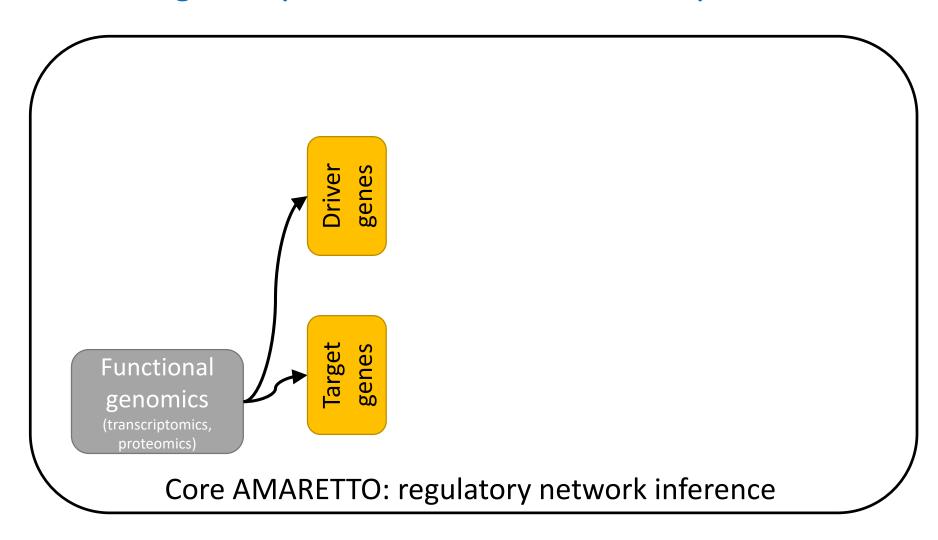
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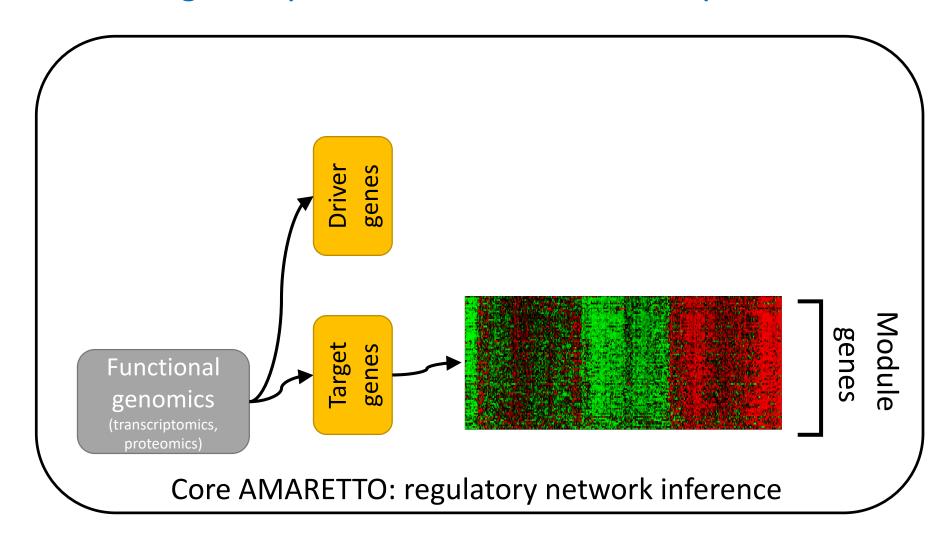


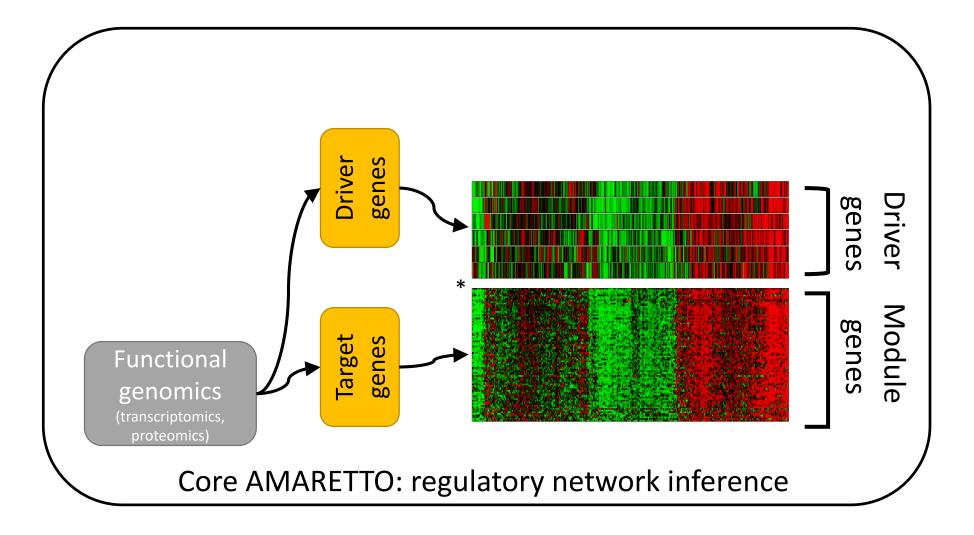
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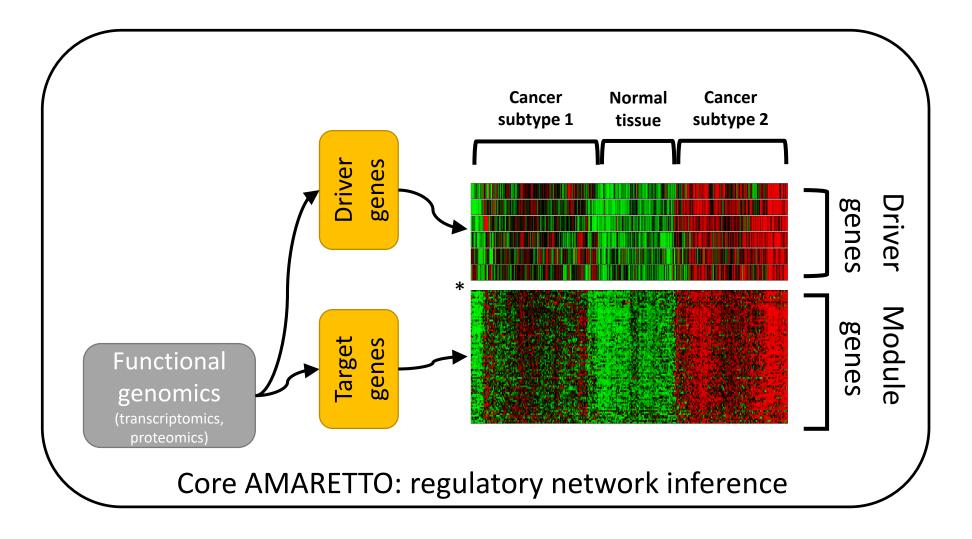
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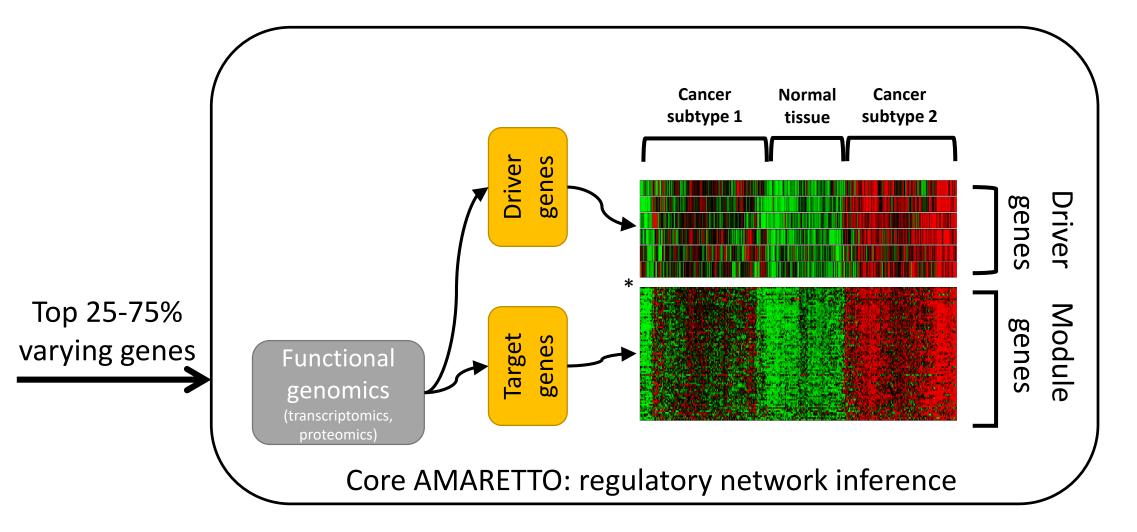


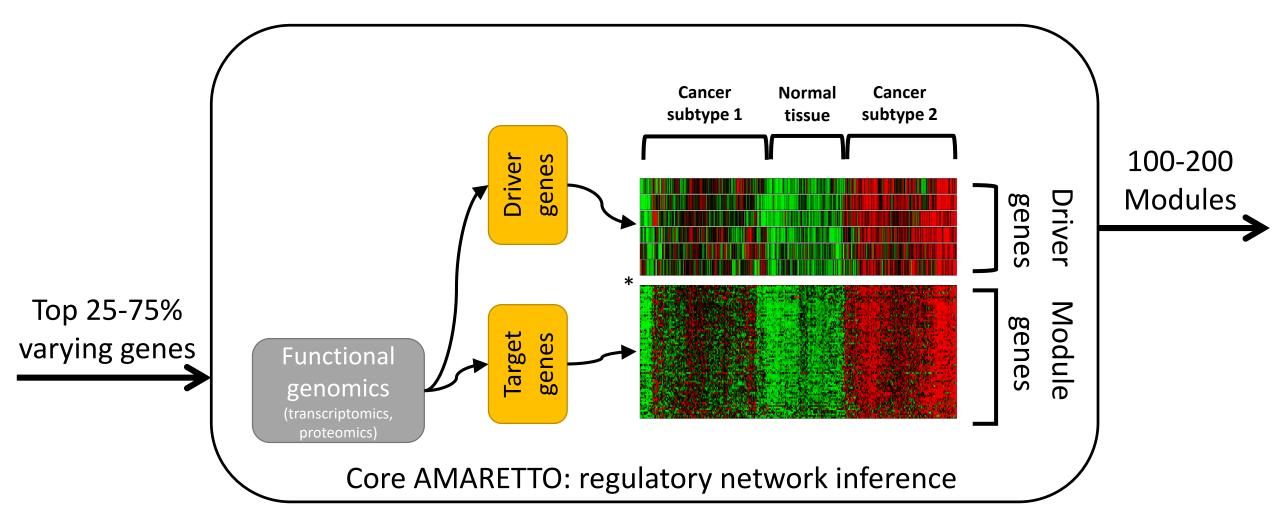




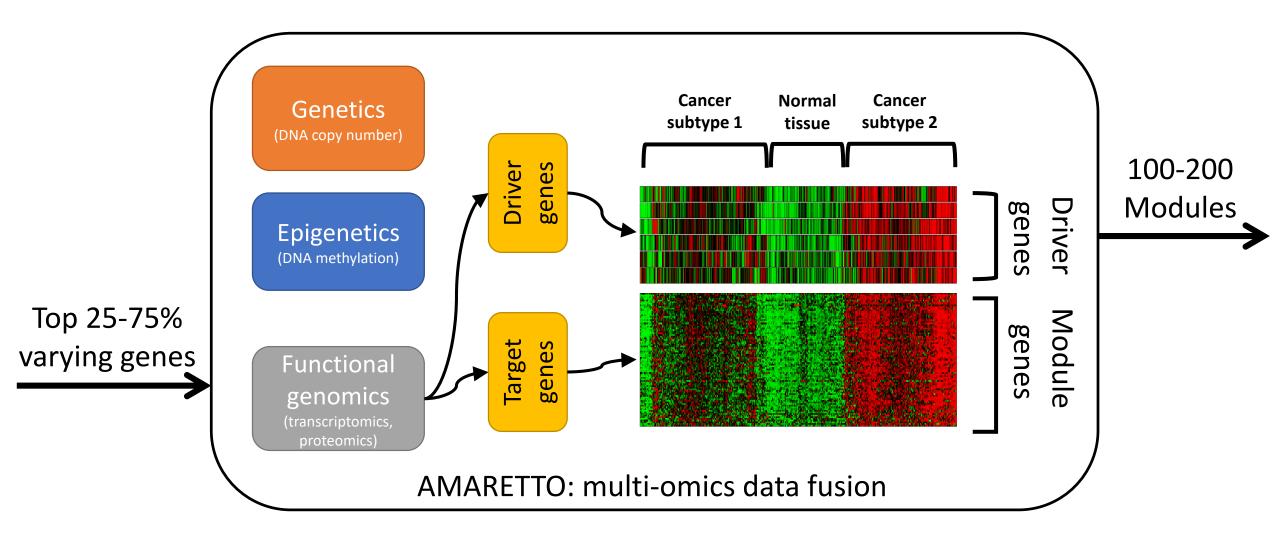




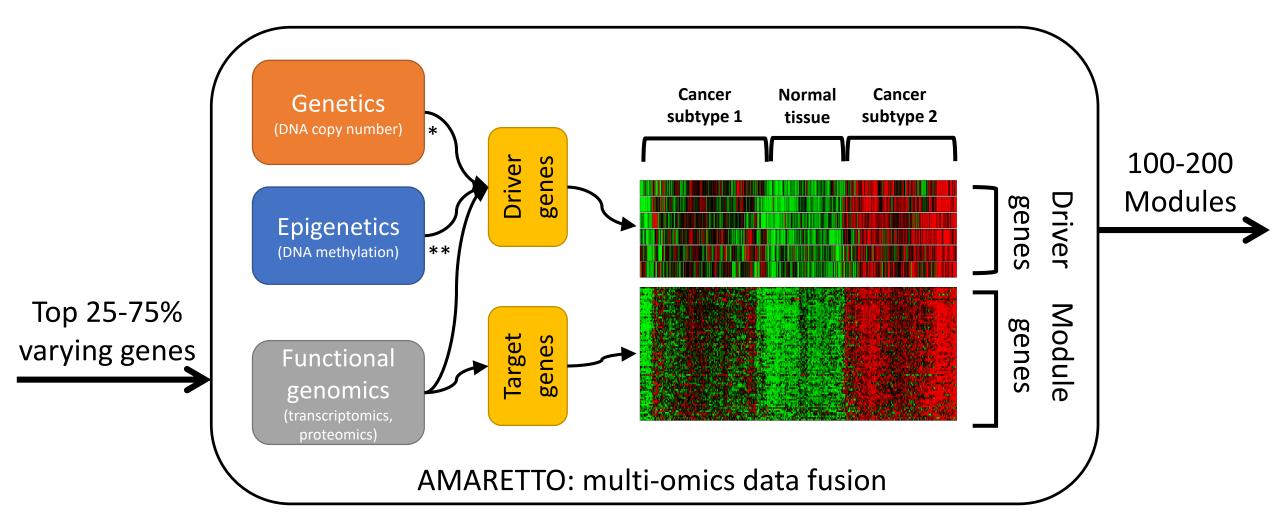




AMARETTO for multi-omics data fusion within systems and diseases

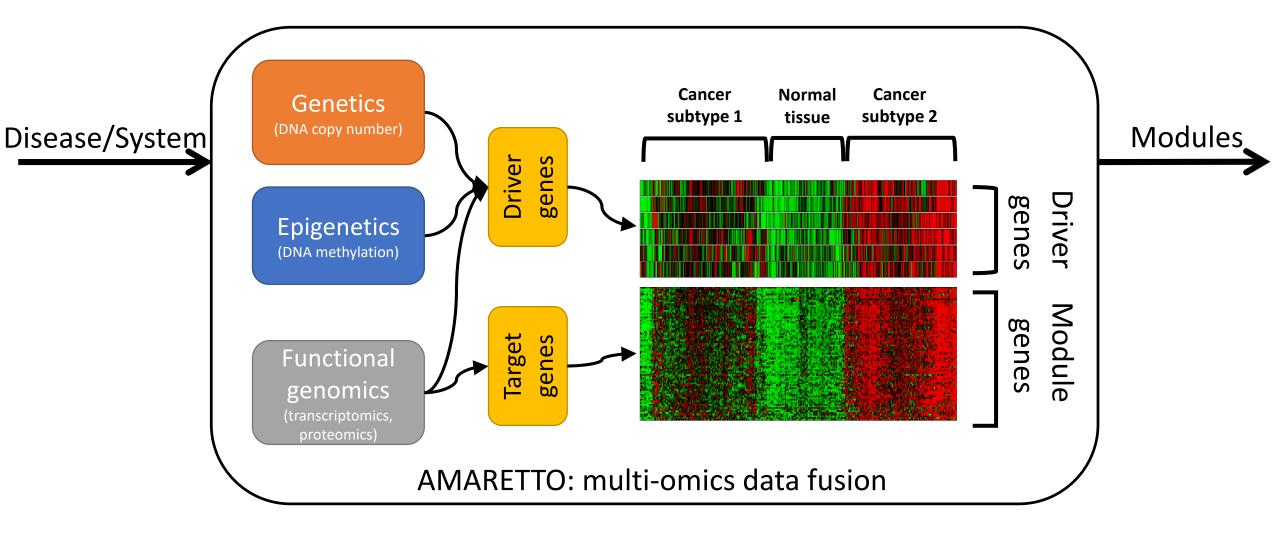


AMARETTO for multi-omics data fusion within systems and diseases

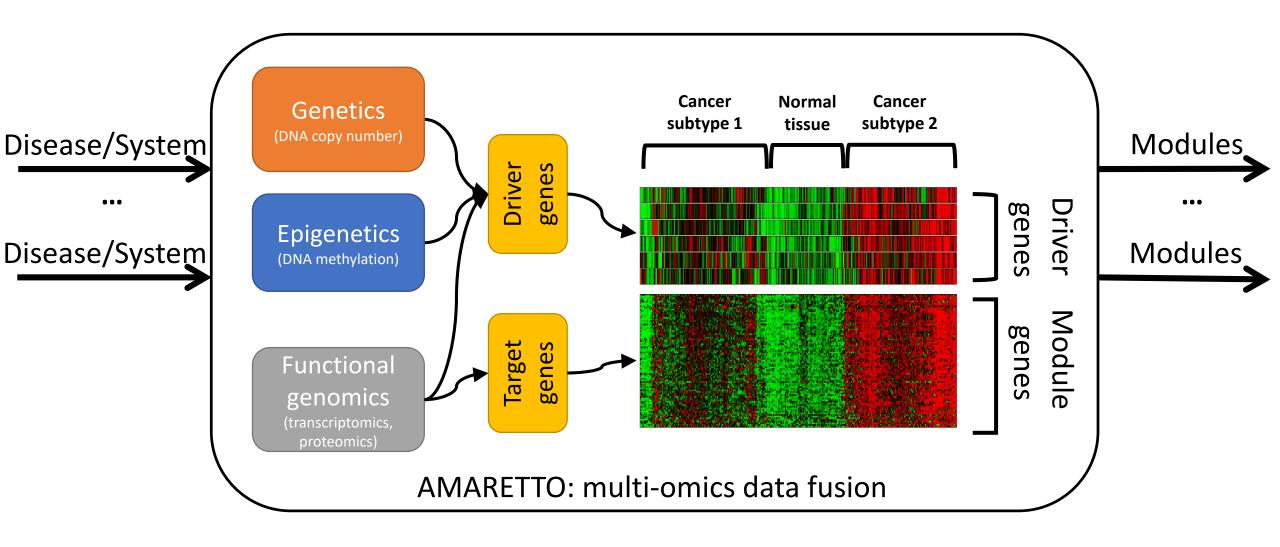


(*) GISTIC: Mermel et al., Genome Biology 2011; Beroukhim et al., Nature 2010 (**) MethylMix: Gevaert, Bioinformatics 2015; Gevaert et al., Genome Biology 2015; Cedoz et al., Bioinformatics 2018

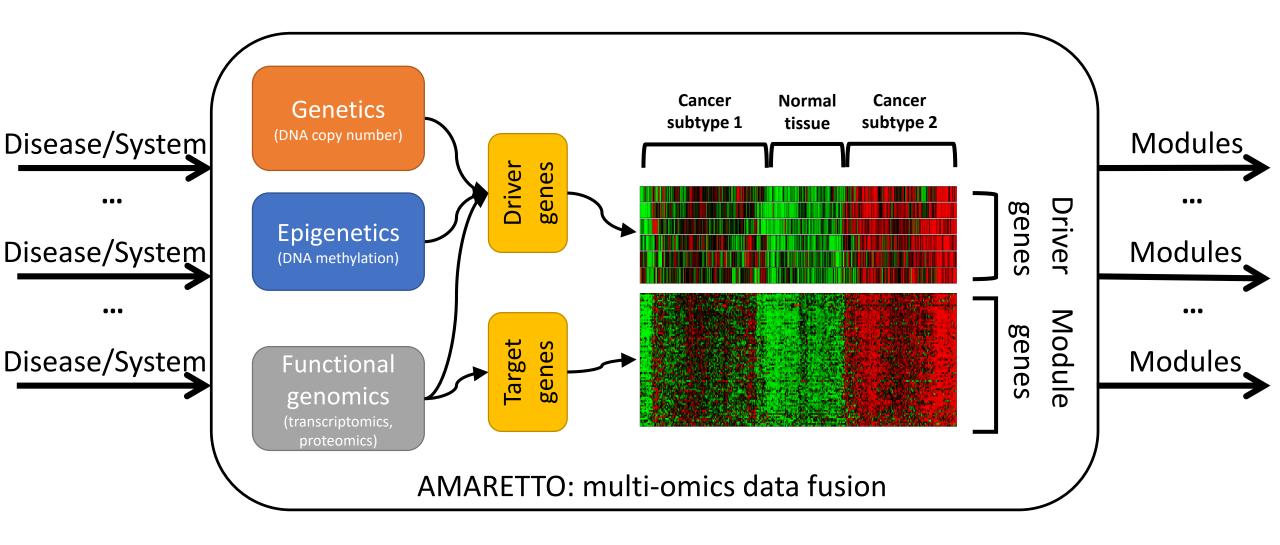
AMARETTO for multi-omics data fusion in multiple systems and diseases



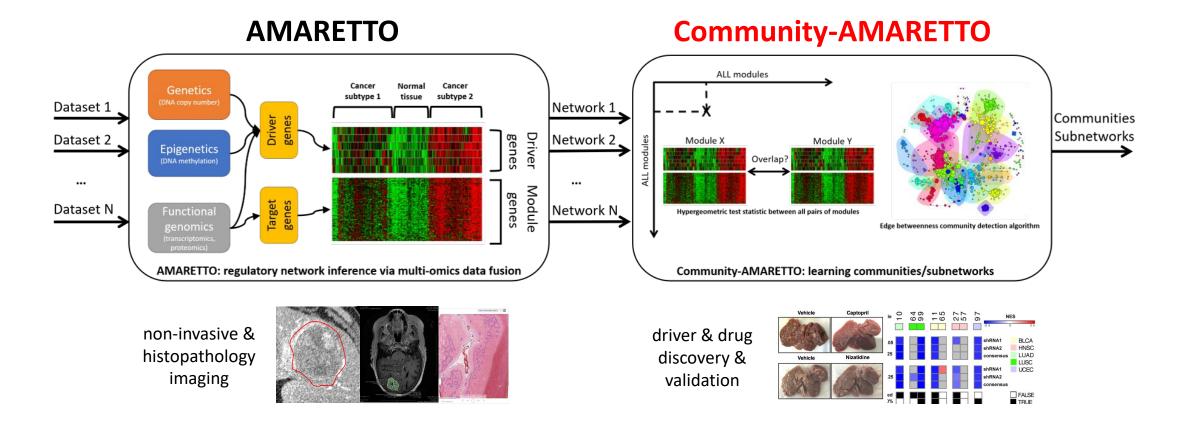
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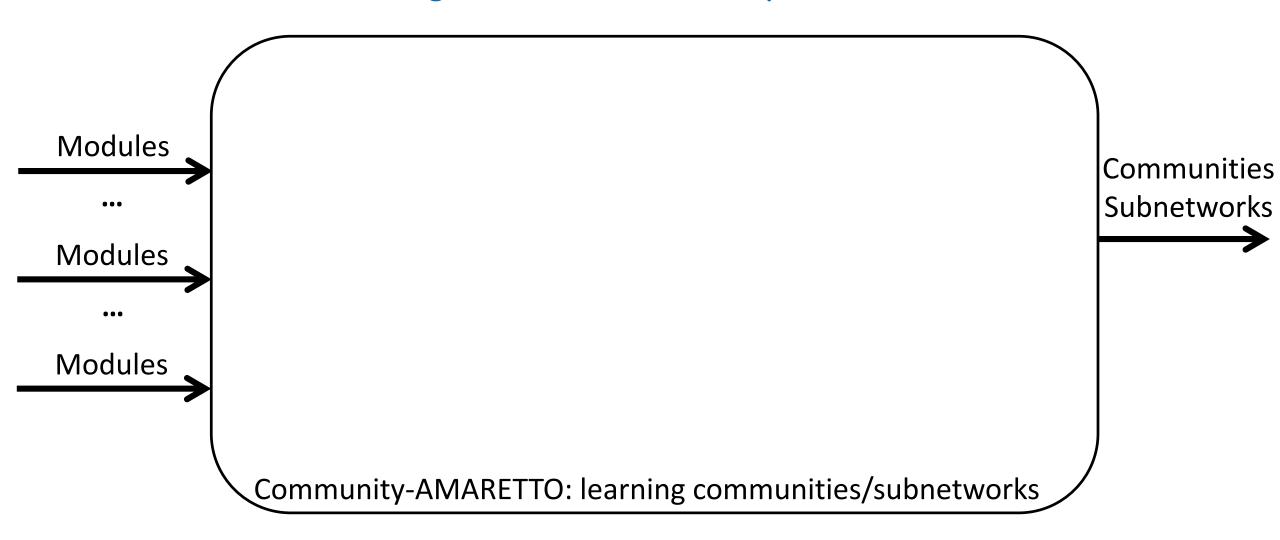


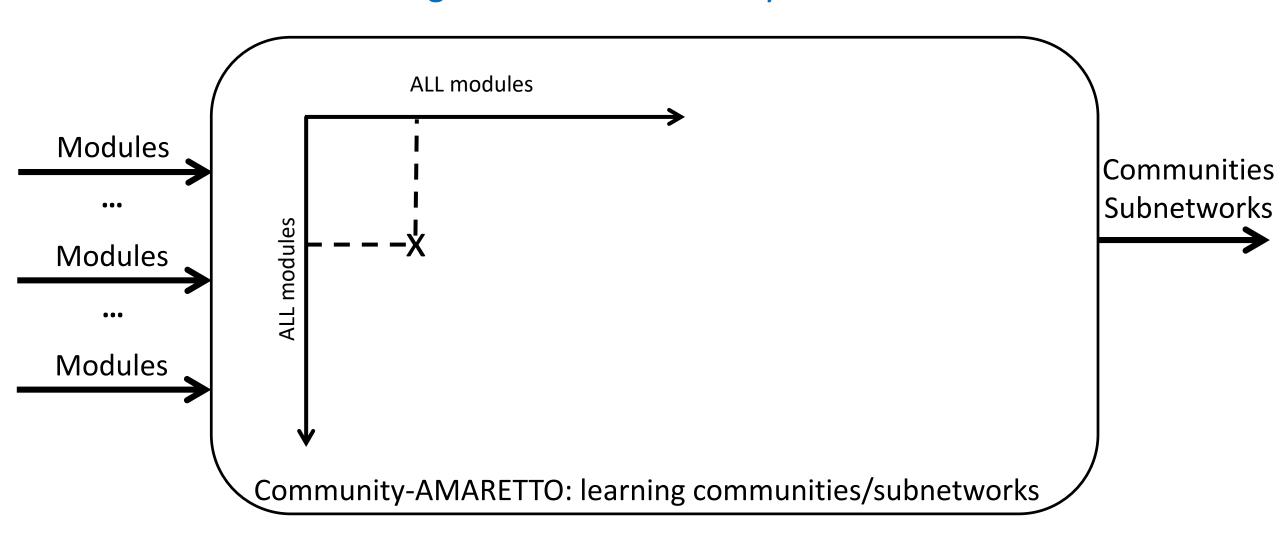
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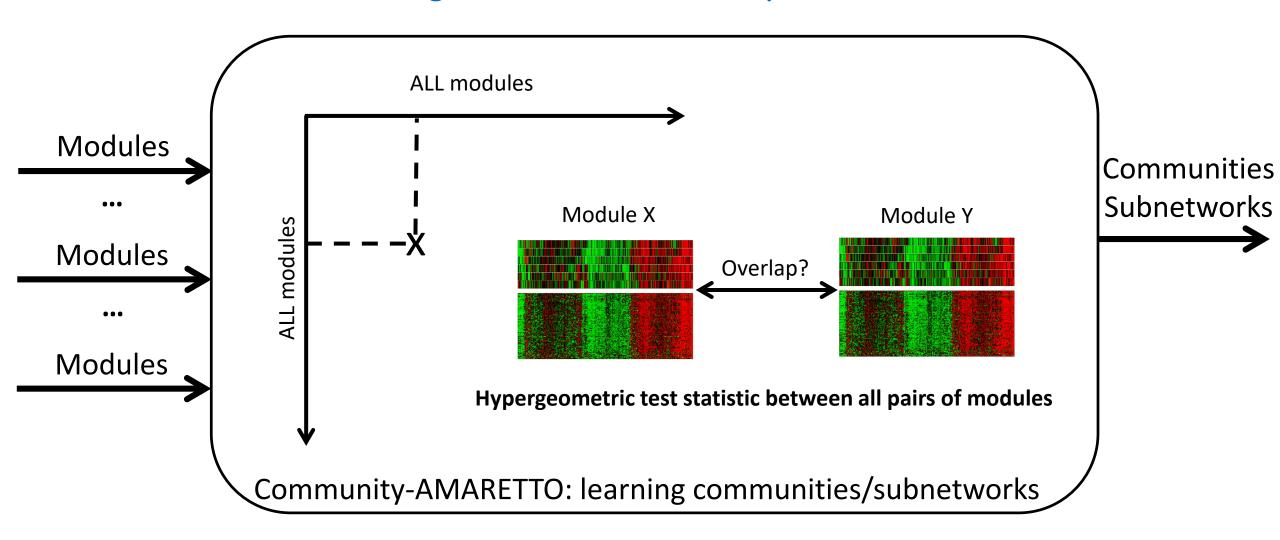


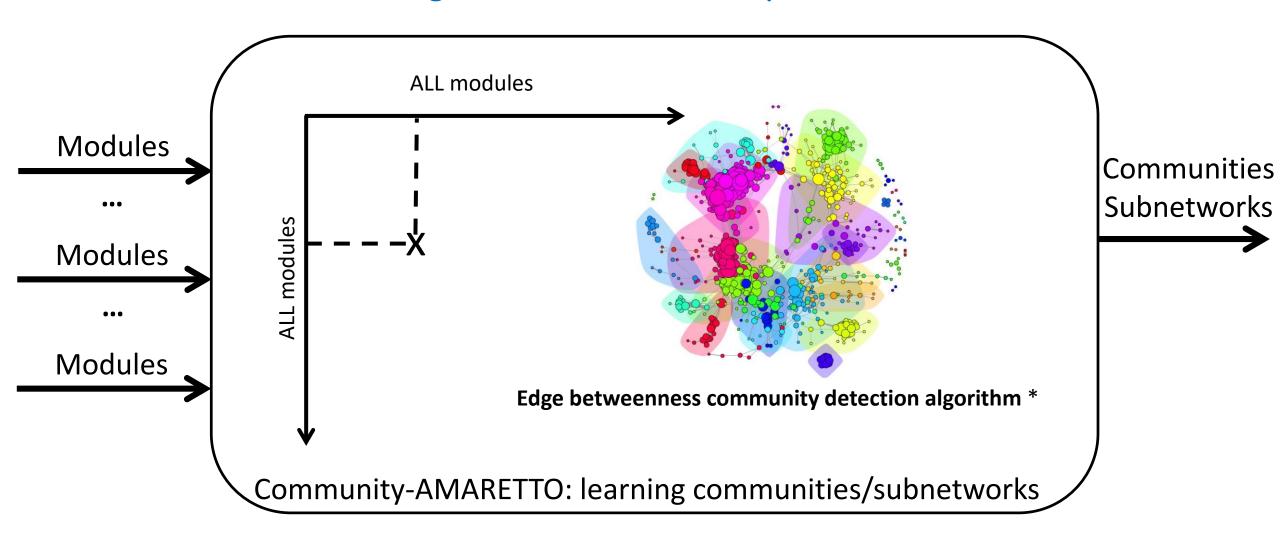
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Functionalities for optimization and downstream analytics

Optimal generalization performance

Stratification for disease phenotypes

Annotation of functional categories

Association with imaging features

Functionalities for optimization and downstream analytics

Optimal generalization performance

Breast cancer

Colorectal cancer

Regare

MSE

Rogare

AML

Stratification for disease phenotypes

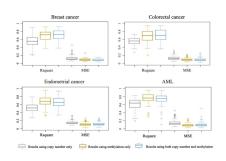
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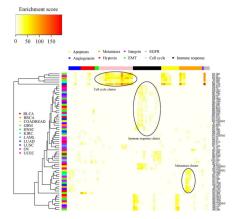
Optimal generalization performance

2AF300 CDC46 CDAFT B DARTT B PARP1 CFRK EstratedVison ActualVison ActualVison Mcdub 22



Stratification for disease phenotypes

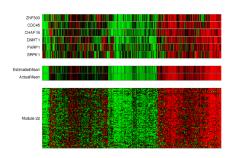
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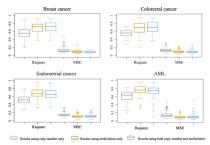


Association with imaging features

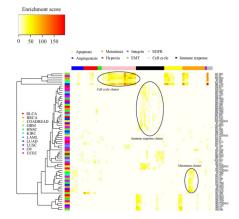
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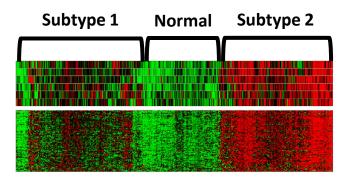




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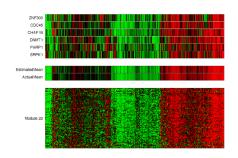
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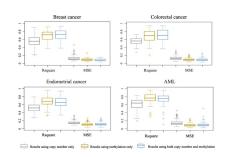


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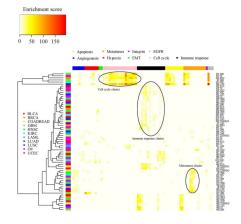
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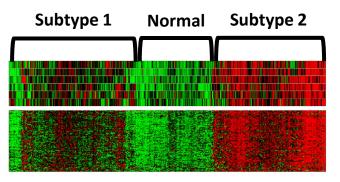




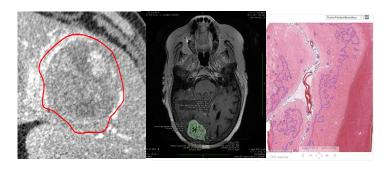
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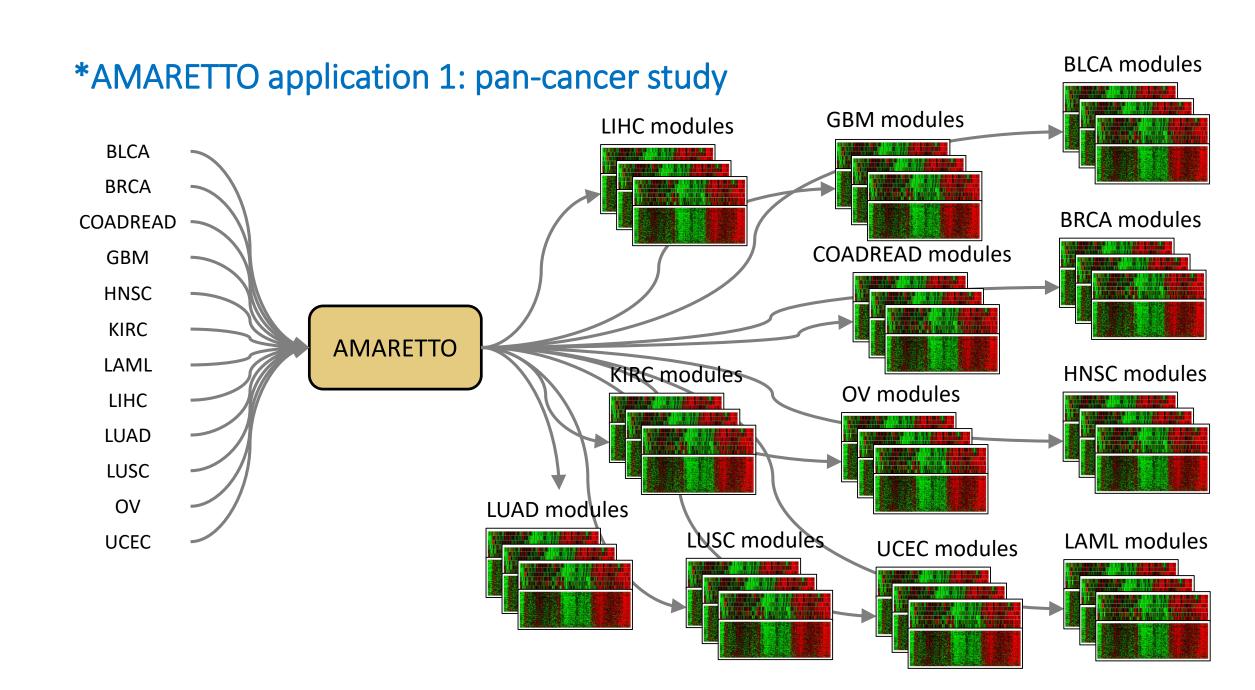
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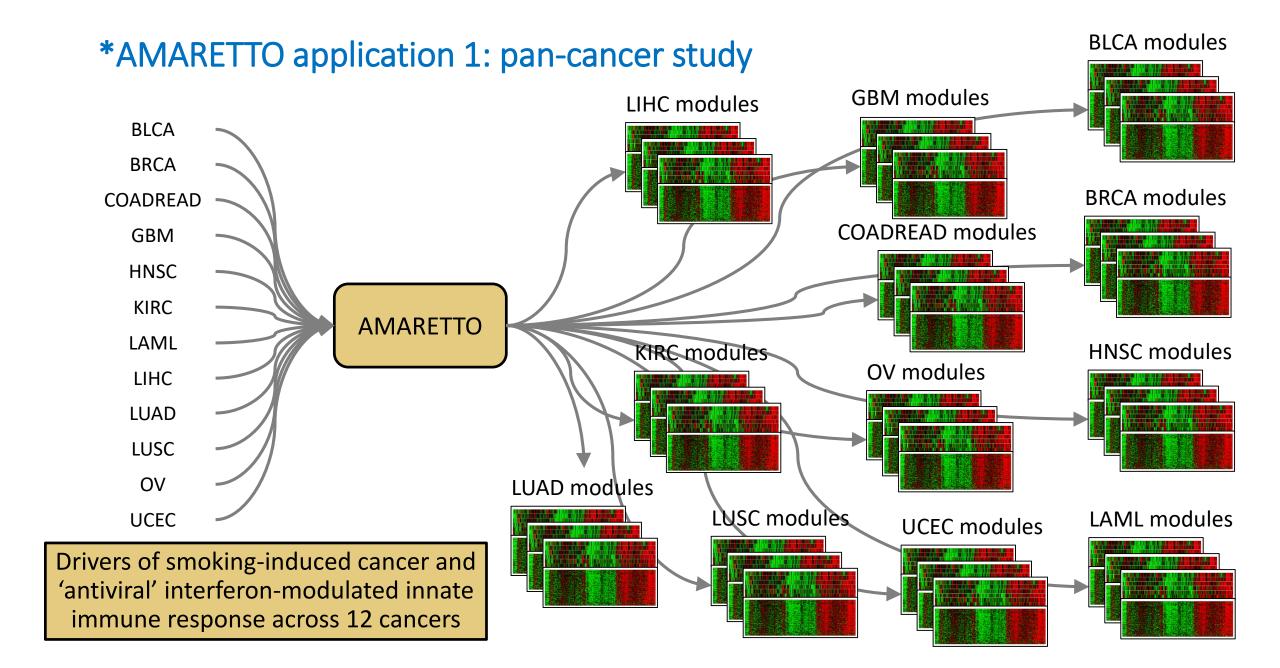


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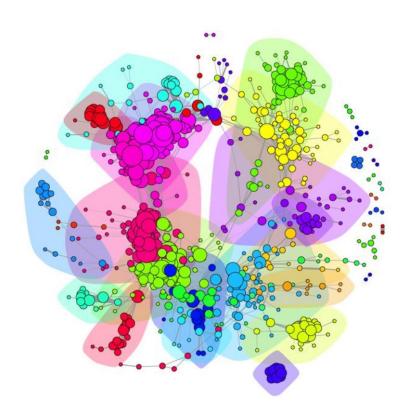


non-invasive & histopathology imaging

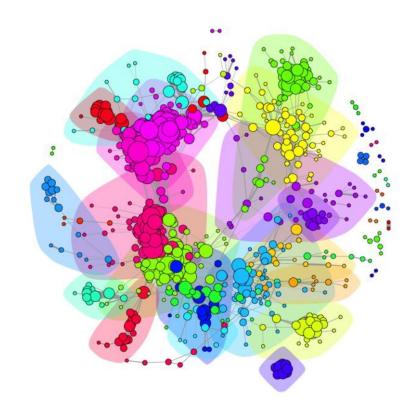


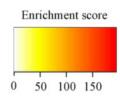


Pan-cancer communities or subnetworks

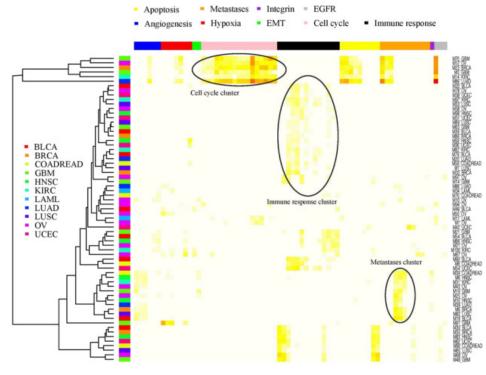


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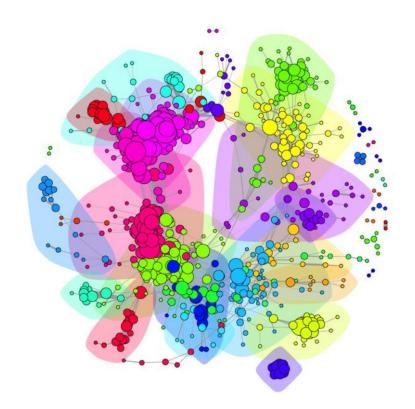


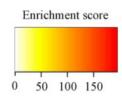


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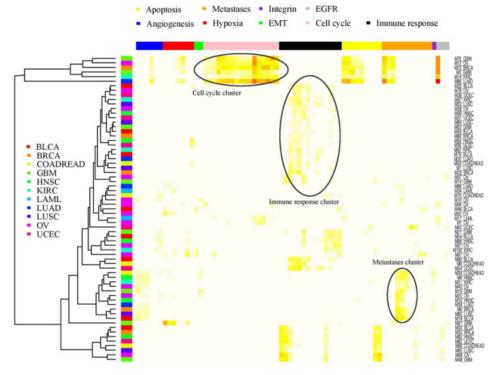


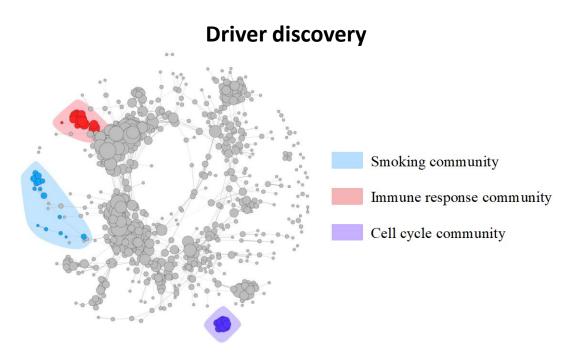
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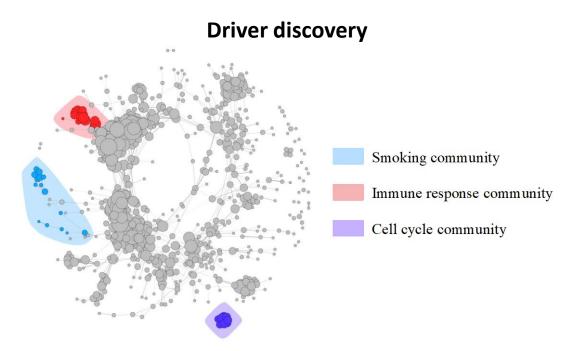


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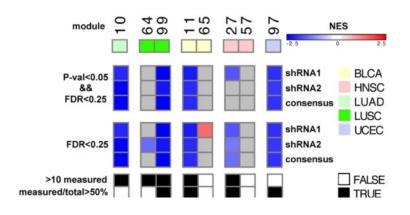




- OAS2 pan-cancer driver of 'antiviral' interferonmodulated innate immune response
- GPX2 pan-cancer driver of smoking-induced cancer



Driver validation



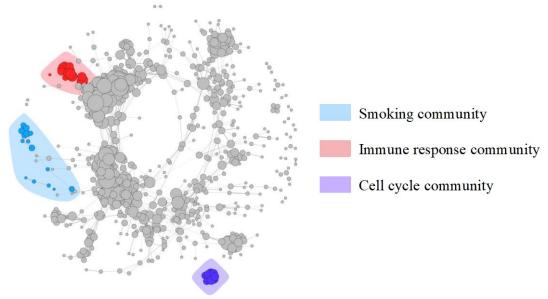
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Genetic perturbation of GPX2 in the A549 (LUAD) cell line

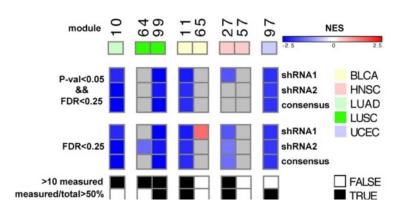
⇒ Knocking down GPX2 represses

target genes in GPX2-regulated modules





Driver validation



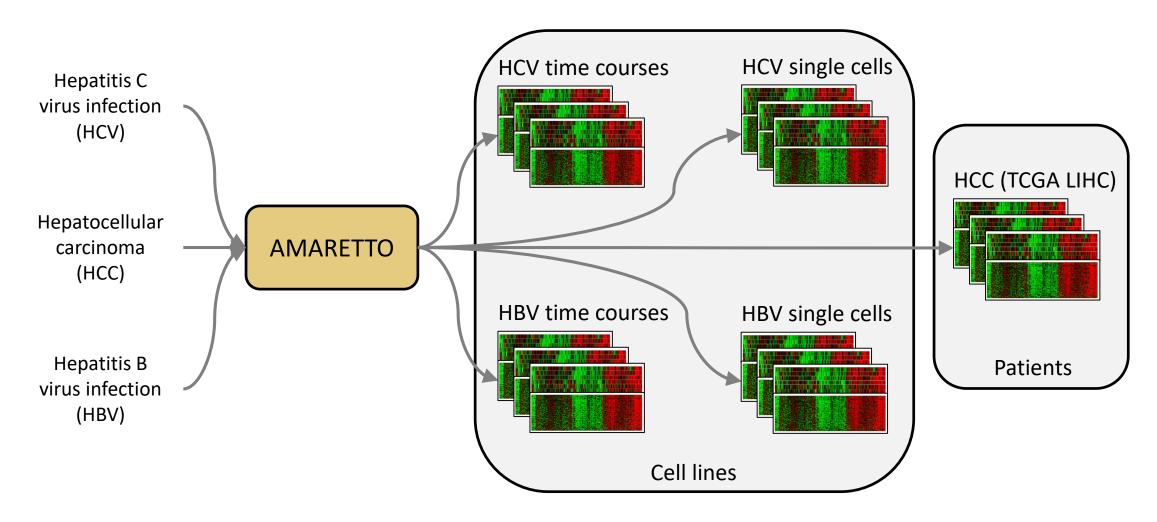
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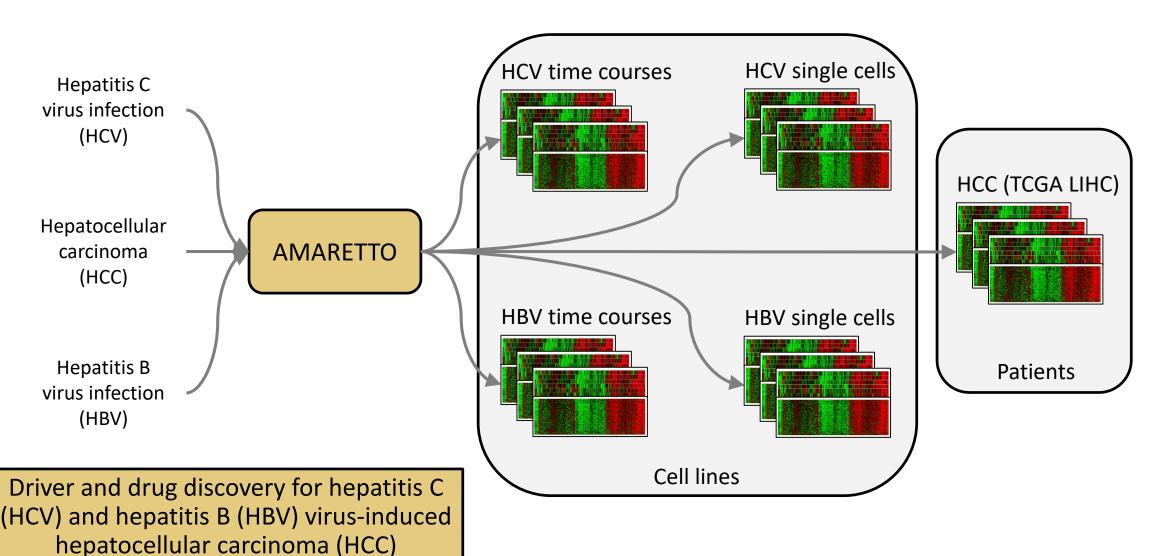
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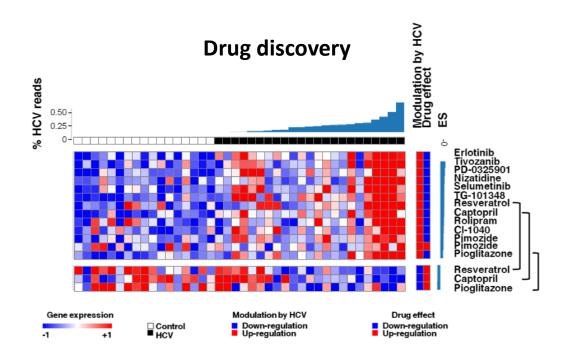
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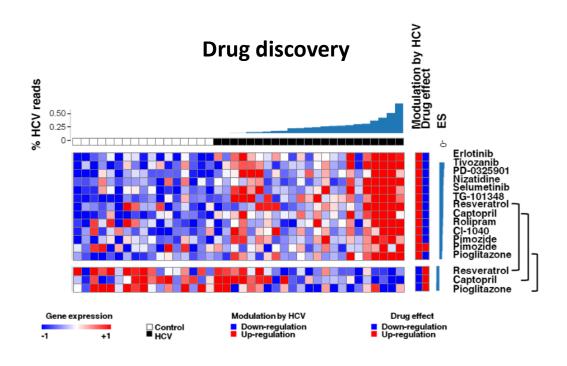
⇒ AMARETTO facilitates identification of known and novel cancer drivers and their targets



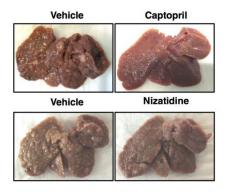




Chemical perturbations in cell lines
Predict which drugs can reverse disease-associated modules
Alternative treatments with less severe adverse effects



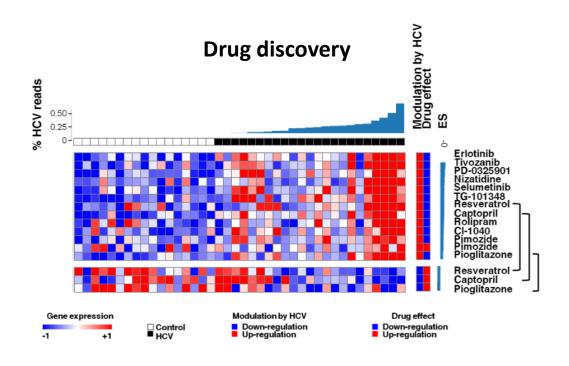
Drug validation



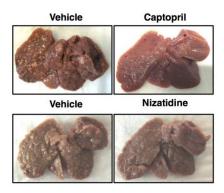
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Experimental validation of drugs in rat models

- ⇒ Two novel compounds attenuate HCC development
- ⇒ Safe and low-cost approach for chemoprevention of HCC?



Drug validation

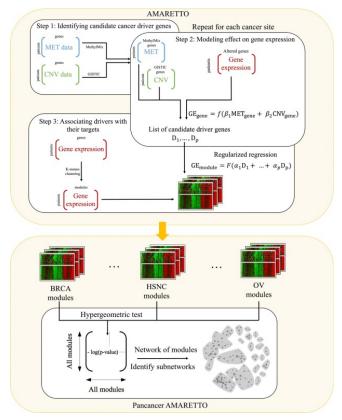


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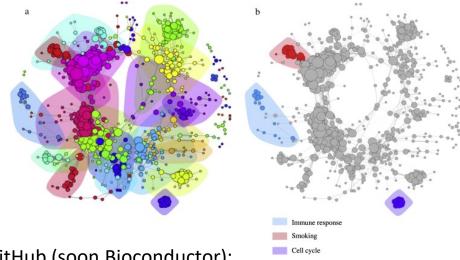
- Experimental validation of drugs in rat models
- ⇒ Two novel compounds attenuate HCC development
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⇒ AMARETTO facilitates identification of known and novel drug compounds and how they modulate cancer drivers and their targets

*AMARETTO source code & analysis tools



Champion et al., EBioMedicine 2018



R packages in GitHub (soon Bioconductor):

- https://github.com/gevaertlab/AMARETTO
- https://github.com/broadinstitute/CommunityAMARETTO

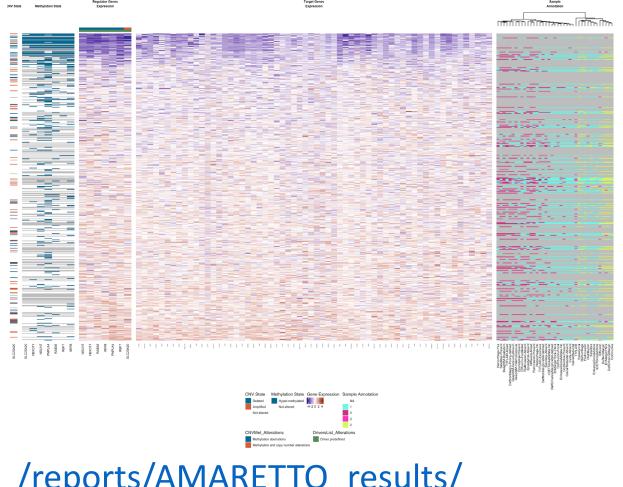
User-friendly analysis modules in GenePattern:

- https://cloud.genepattern.org/ module.analysis:00378
- https://cloud.genepattern.org/ module.analysis:00380

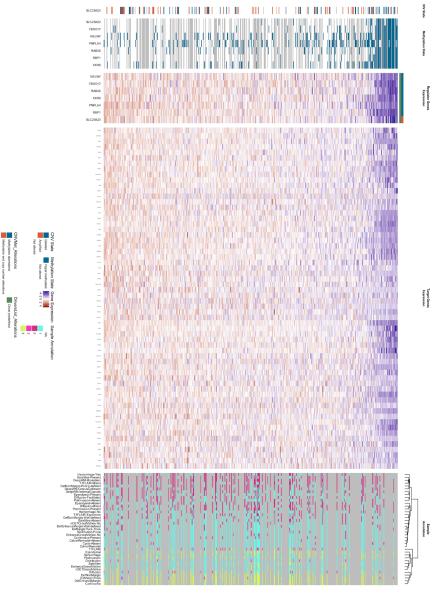
*AMARETTO:

- 1. Captures hallmarks of cancer
- 2. Facilitates identification of known and novel cancer drivers and their targets
- 3. Facilitates identification of known and novel drug compounds and how they modulate cancer drivers and their targets

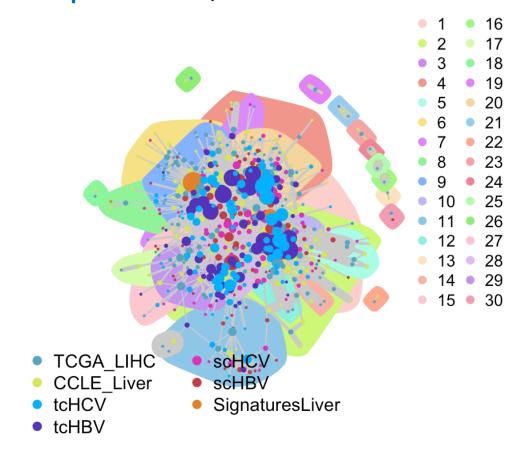
AMARETTO report: multi-omics & imaging data fusion in GBM



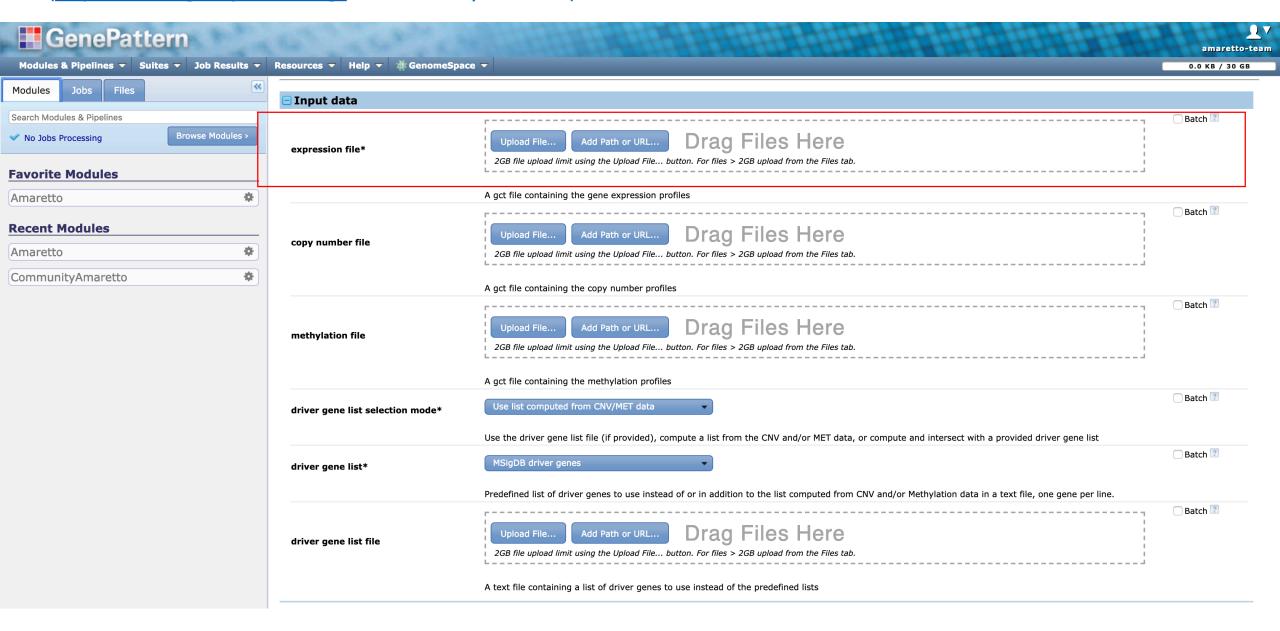
/reports/AMARETTO results/

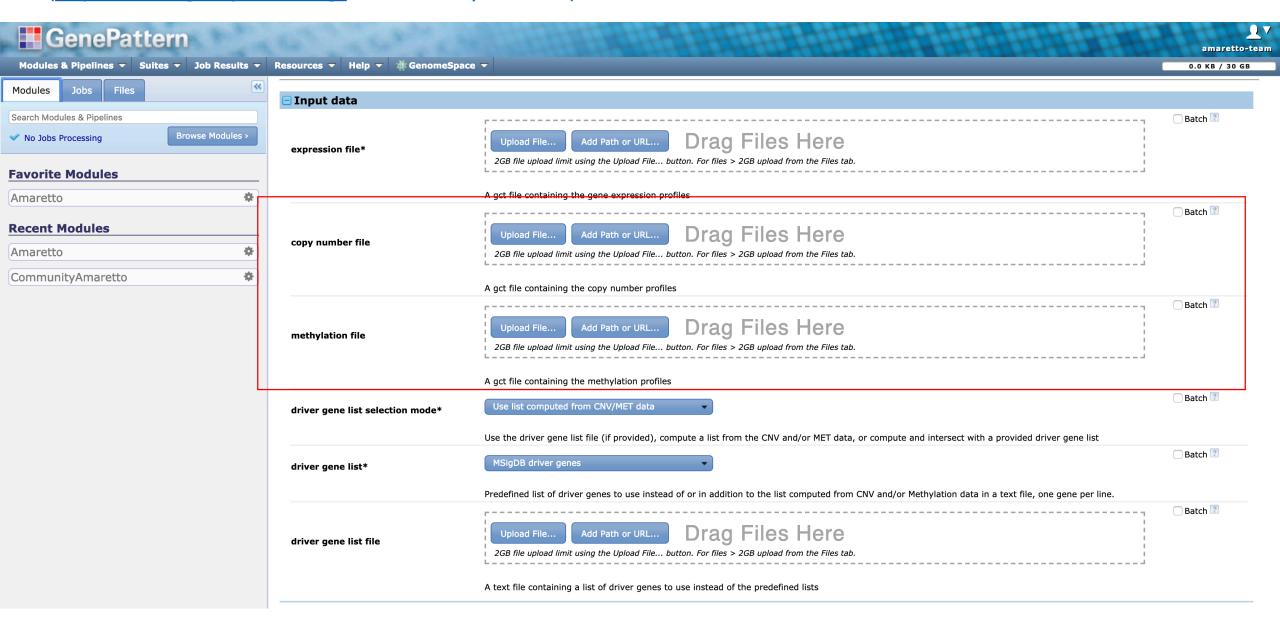


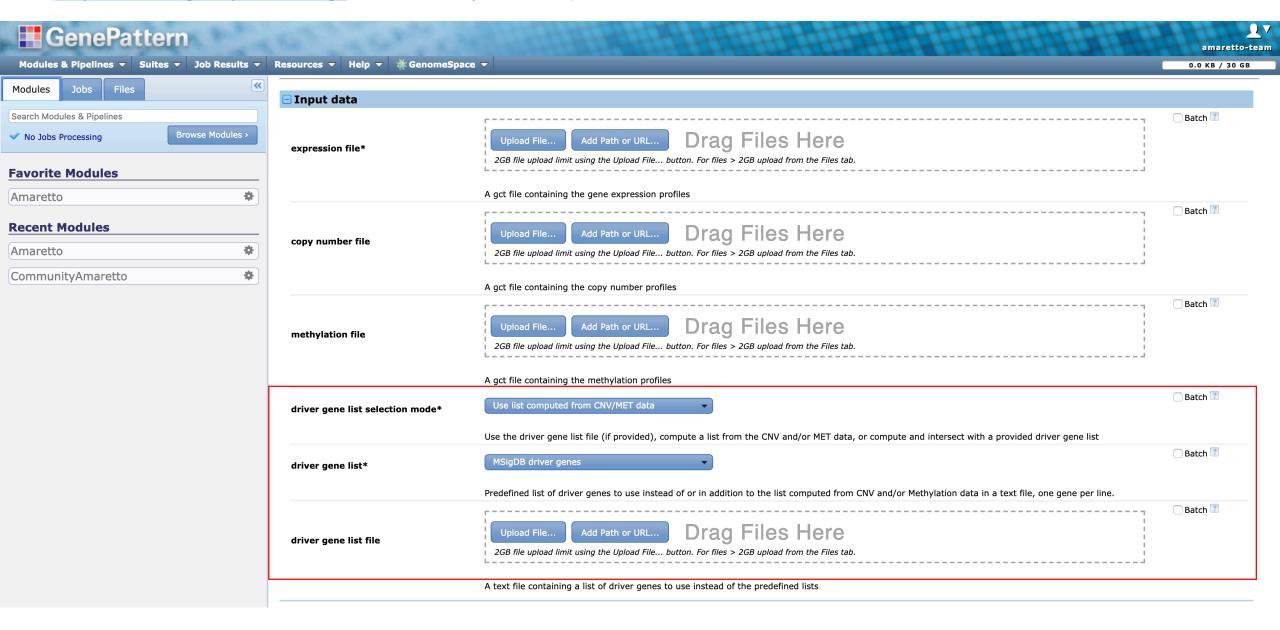
Community-AMARETTO report: HCV/HBV virus-induced HCC/LIHC

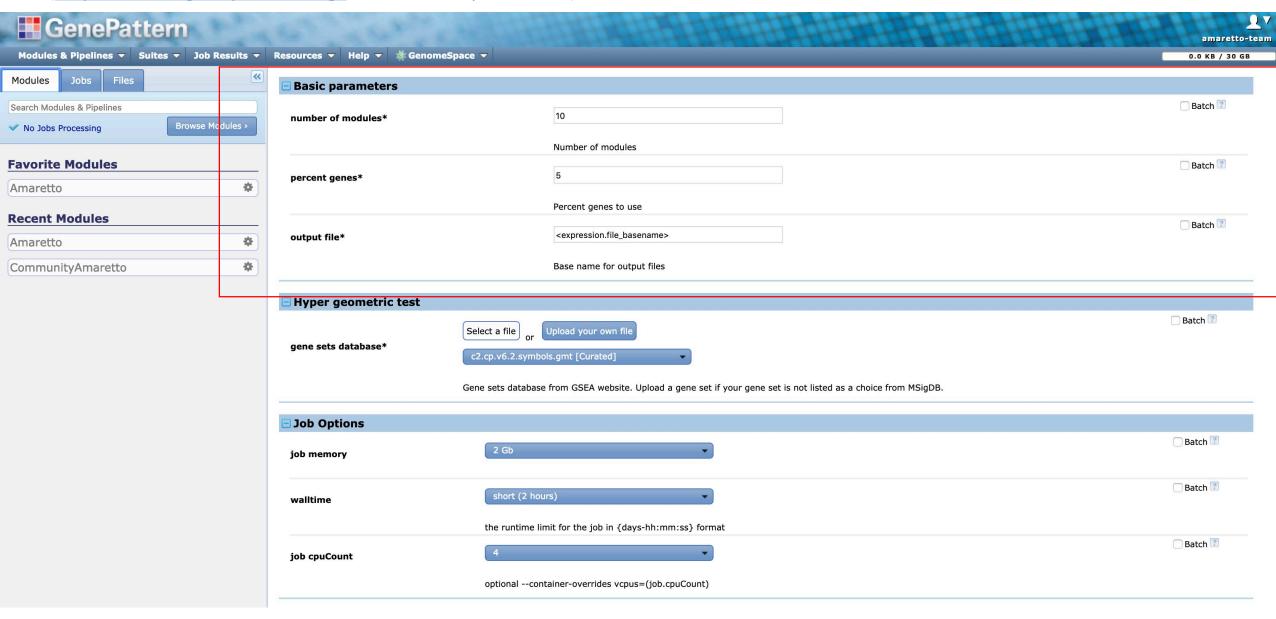


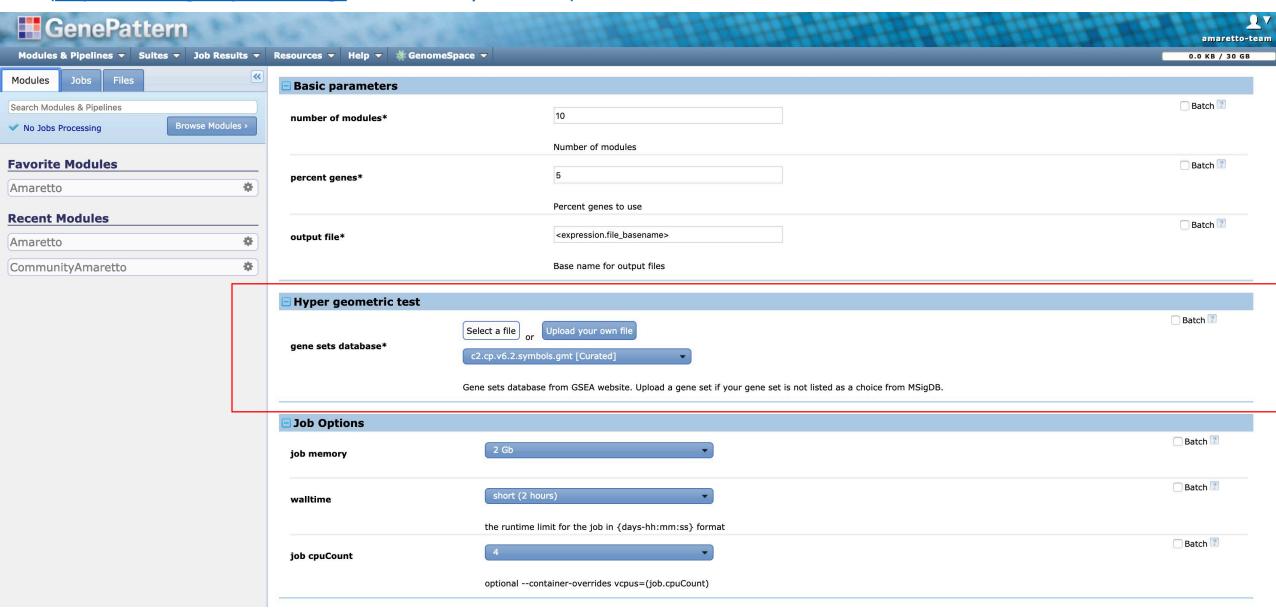
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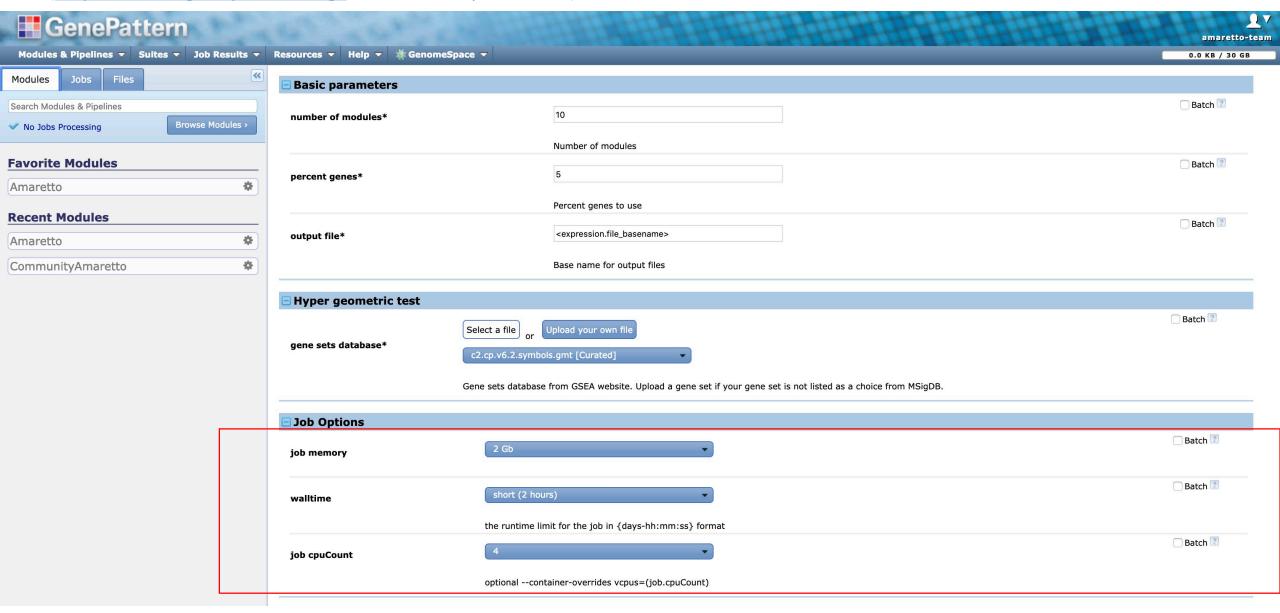




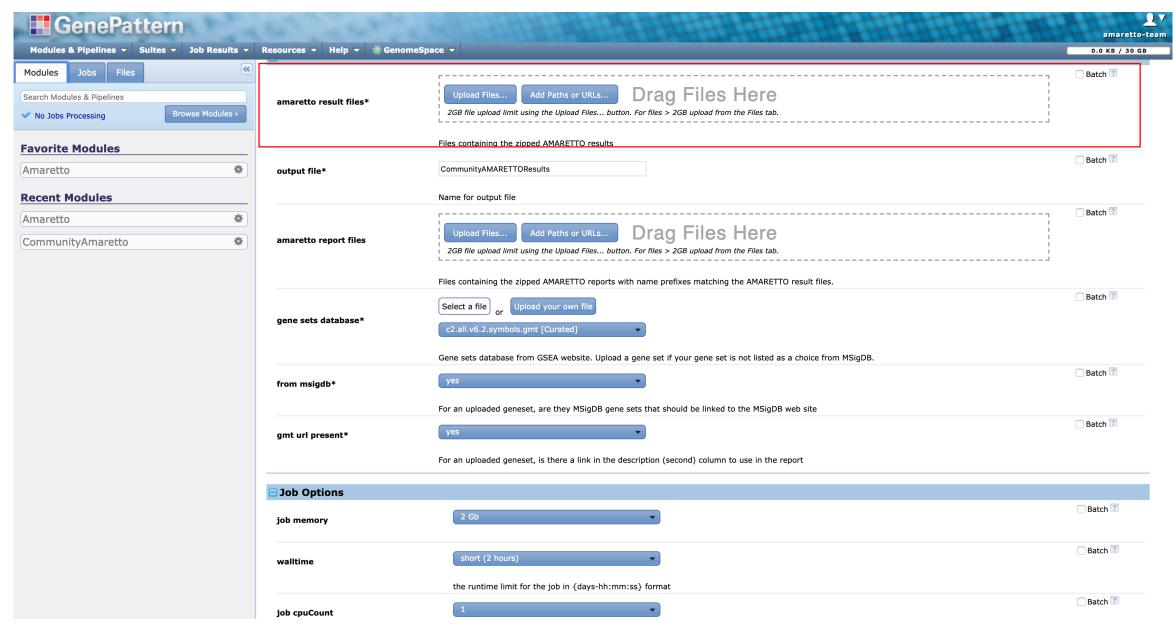




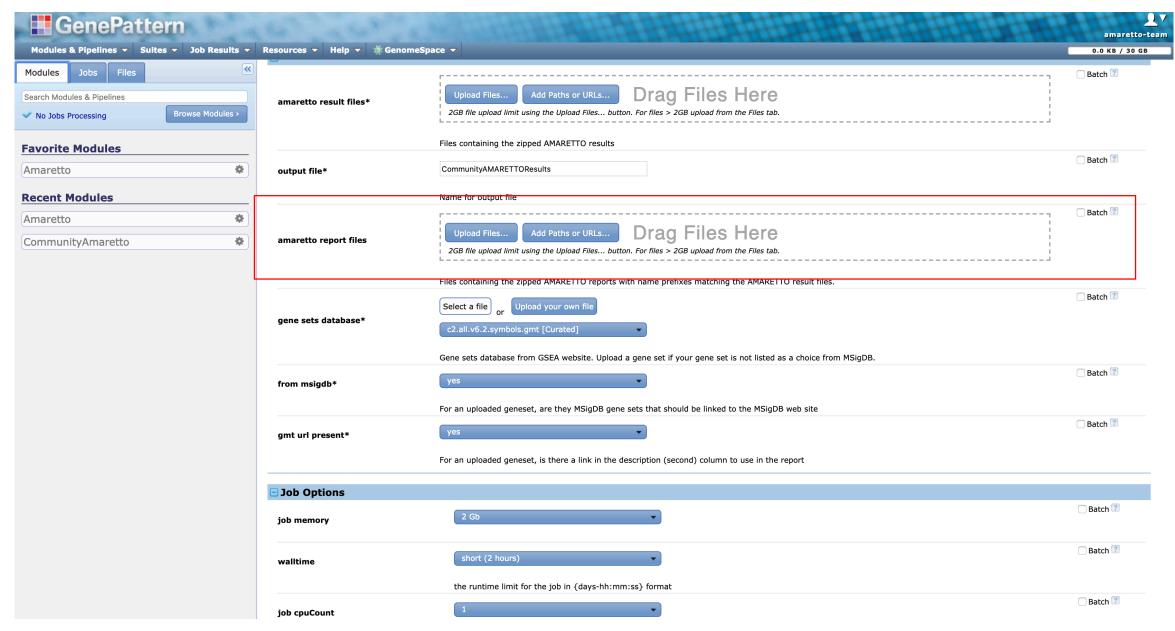




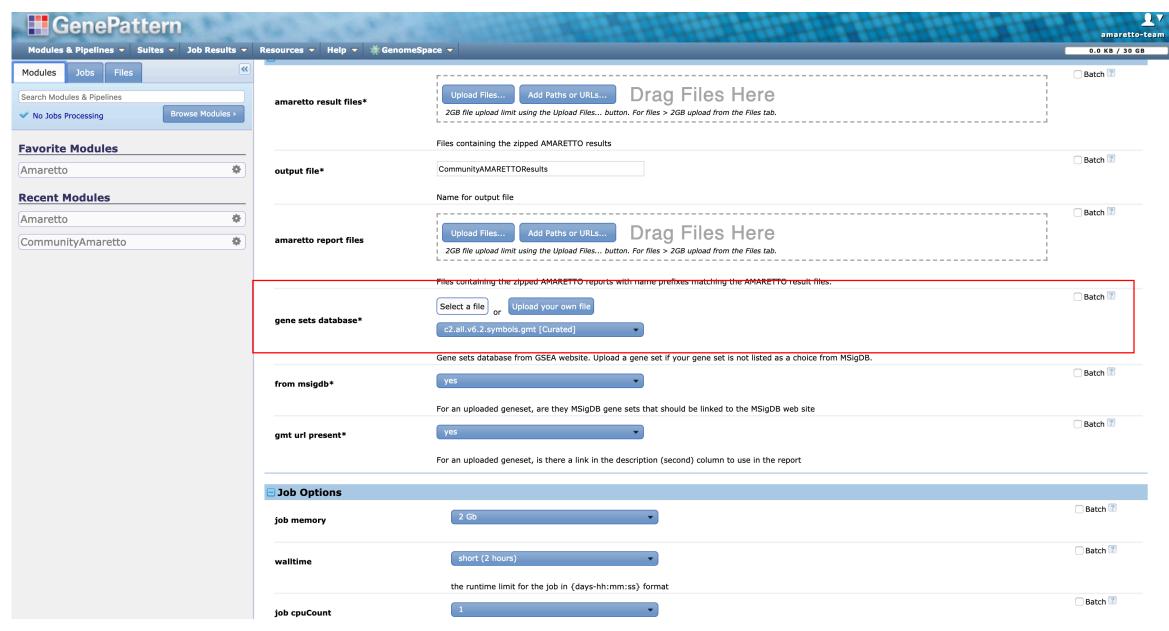
Community-AMARETTO module in GenePattern



Community-AMARETTO module in GenePattern

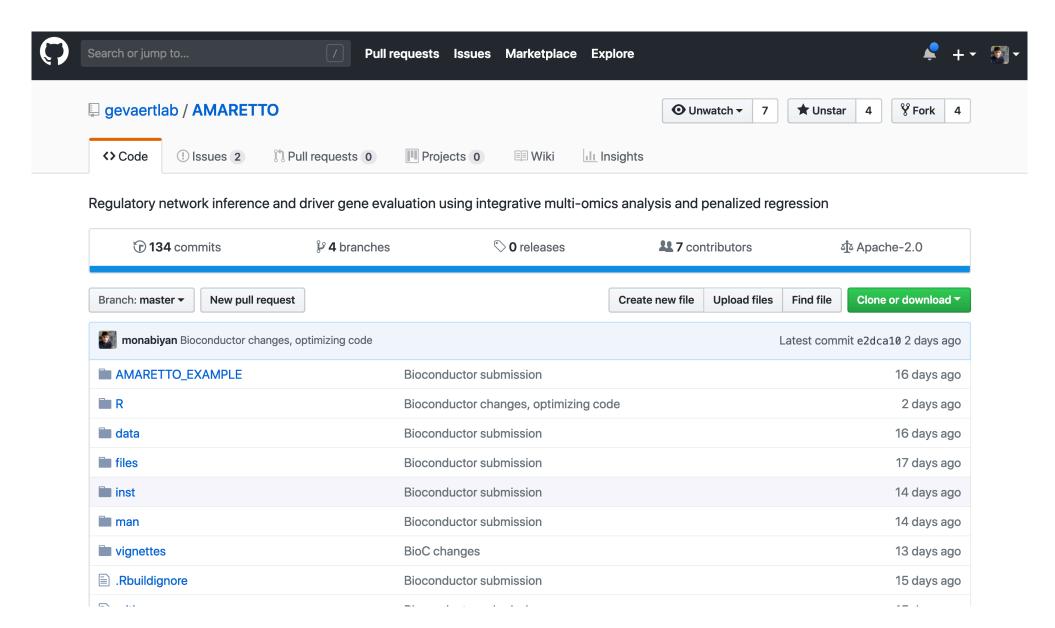


Community-AMARETTO module in GenePattern



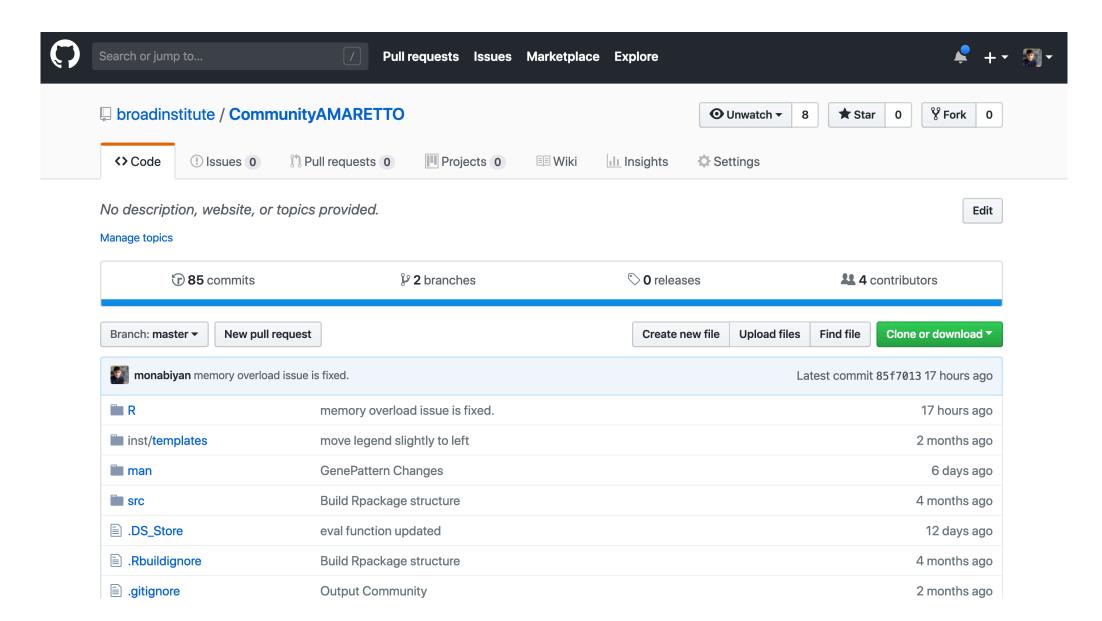
AMARETTO module in Github

(https://github.com/gevaertlab/AMARETTO)



Community-AMARETTO module in Github

(https://github.com/broadinstitute/CommunityAMARETTO)



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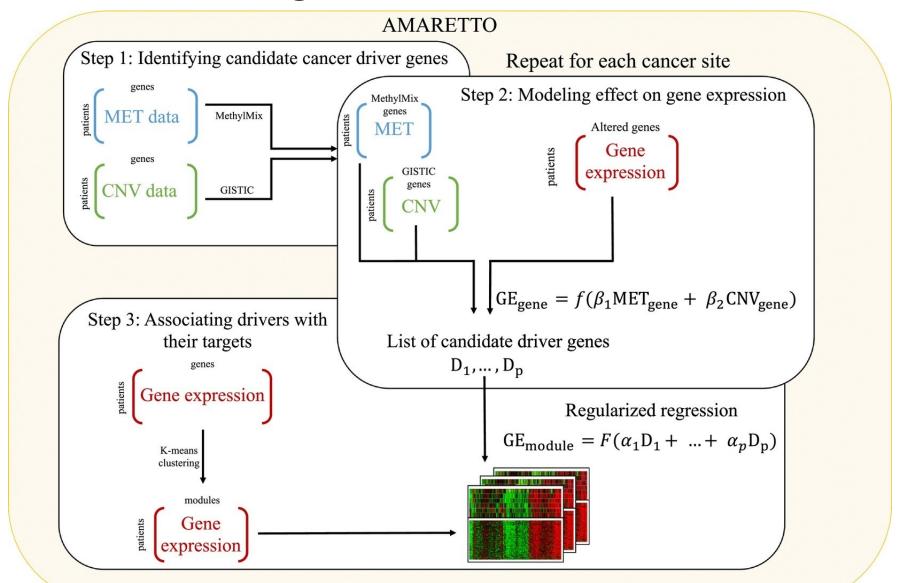
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AMARETTO infers regulatory cell circuits – cancer drivers and their targets – via multi-omics data fusion



Community-AMARETTO learns communities across regulatory networks inferred from different resources

