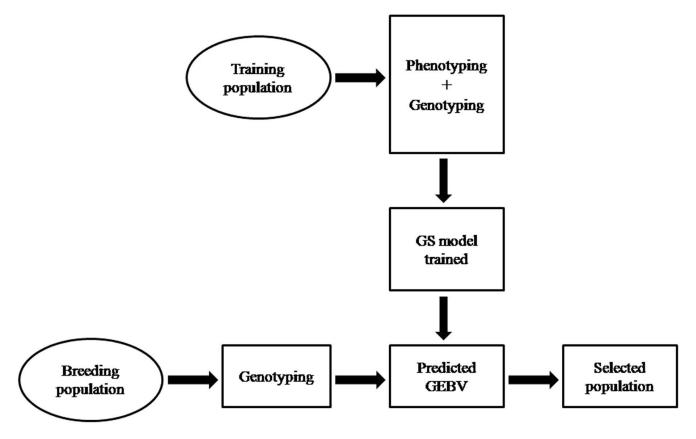


Galaxy for Crops: Genomic Selection

Venice Margarette JuanillasSpecialist- Information Systems





Source: "Genomic Selection in the Era of Next Generation Sequencing for Complex Traits in Plant Breeding" (Bhat, J.A, et al, 2016)

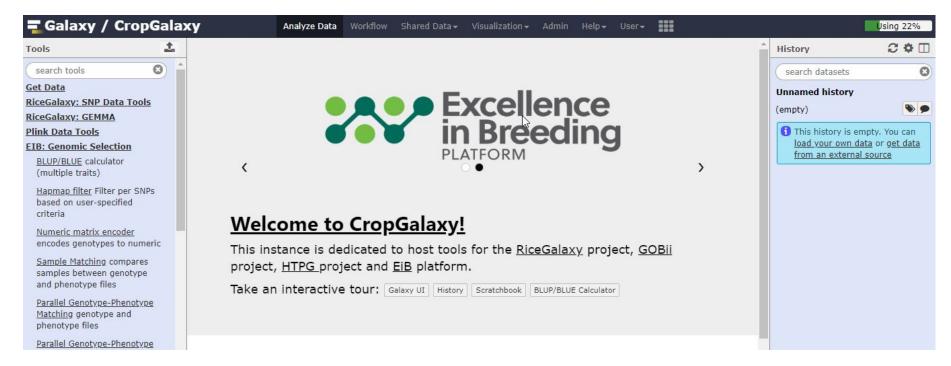




http://13.250.245.3/







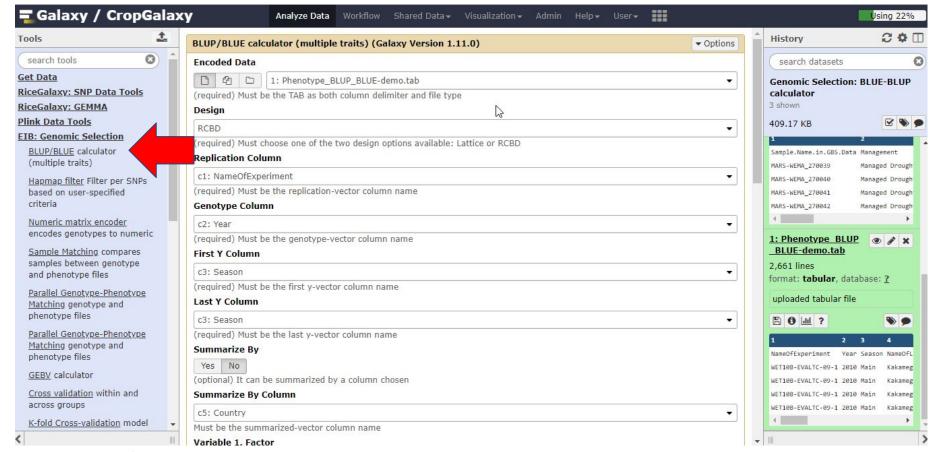
soon: https://cropgalaxy.excellenceinbreeding.org





A. BLUE/BLUP Calculator

- Best Linear Unbiased Estimates (BLUE)
- Best Linear Unbiased Prediction (BLUP)
- Estimation of random effects



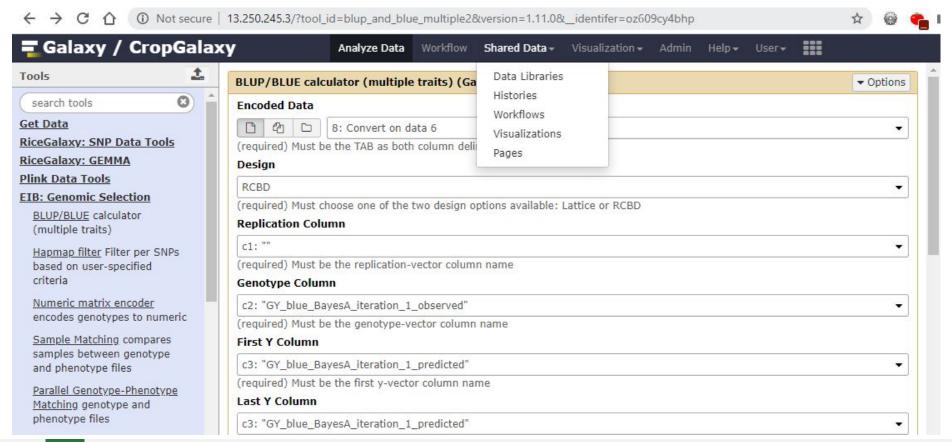
BLUE/BLUP calculator





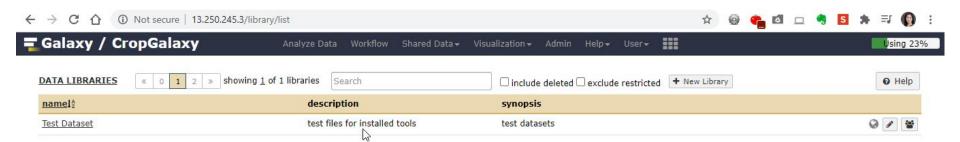
- 1. Dataset:
 - a. Shared Data-> Data Libraries-> TestDataset-> Genomic Selection->BLUE/BLUP
 - b. Select "Phenotype_BLUP_BLUE-demo.tab"
 - c. Import to History.
 - d. Click Green pop-up to start analyzing it.



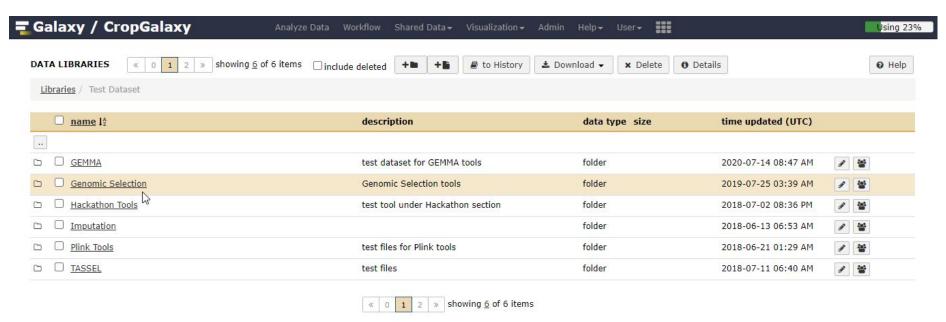






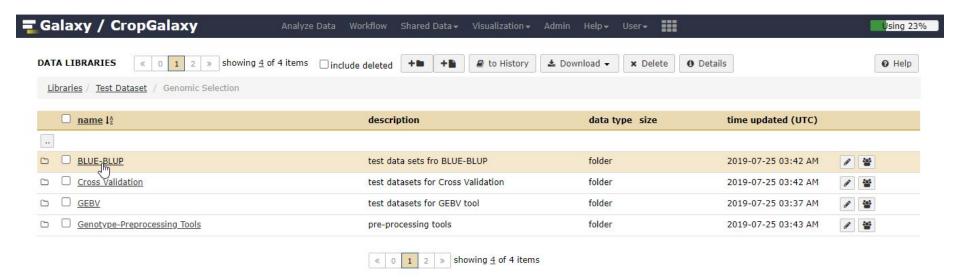






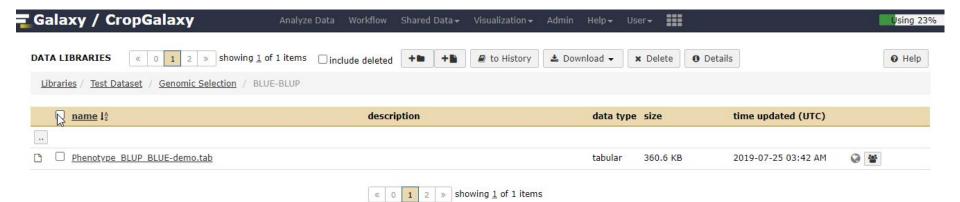




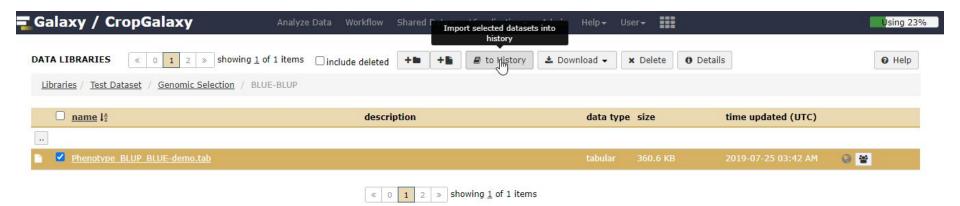






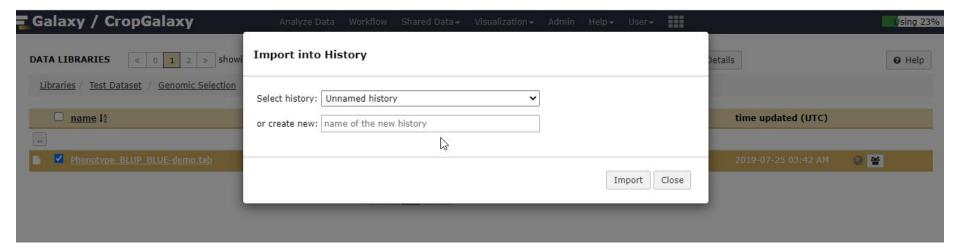




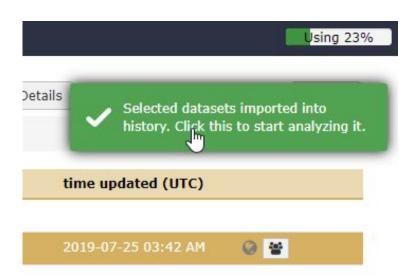


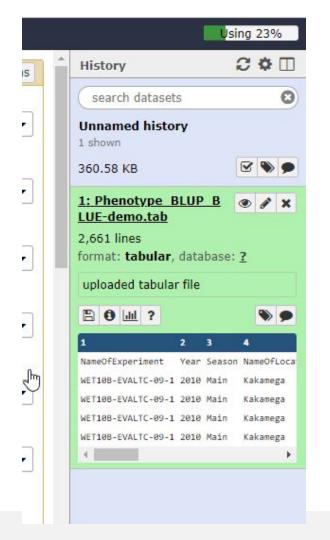






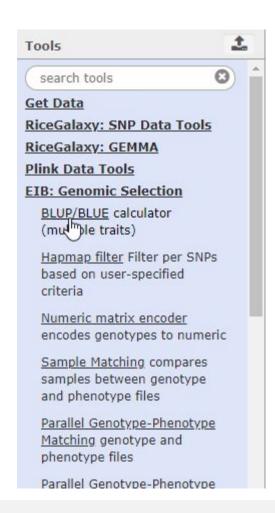








- 2. Tool:
- a. Go to Tools-> EIB: Genomic Selection->BLUE/BLUP calculator





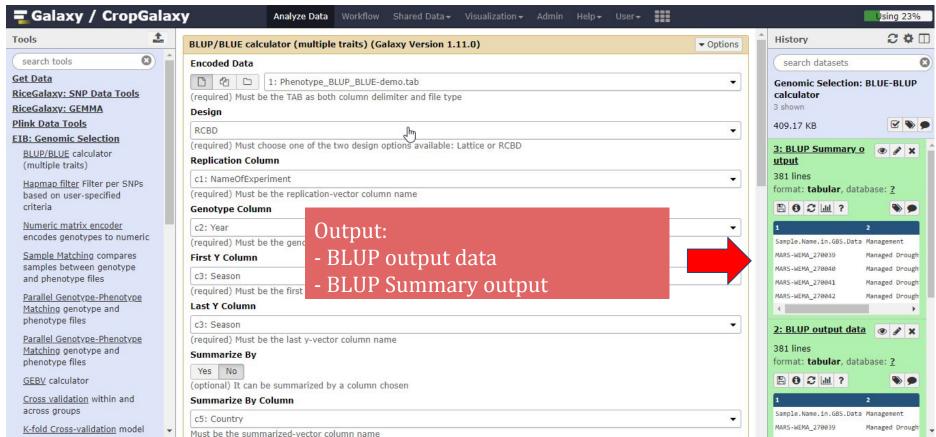
3. BLUE/BLUP Calculator

Encoded Data:

Phenotype_BLUE_BLUP-demo.tab





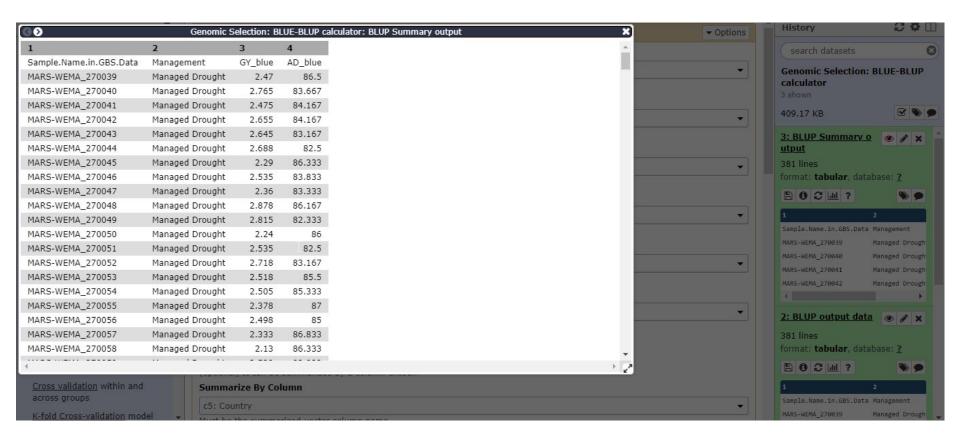




Galaxy / Crop			Analyze Da	ta Workf	flow Shared Data •	- Visualizati	on ▼ Admi	in Help √	User▼	 ,	
30				Genomic	Selection: BLUE-BLU	P calculator: E	BLUP output	data			
1	2	3	4	5	6	7	8	9	10	11	12
Sample.Name.in.GBS.Data	Management	GY_blue	GY_blup	GY_PEV	GY_pevReliability	GY_means	AD_blue	AD_blup	AD_PEV	AD_pevReliability	AD_means
MARS-WEMA_270039	Managed Drought	2.47	2.682	0.004	0.045	2.47	86.5	85.107	0.353	0.327	86.5
MARS-WEMA_270040	Managed Drought	2.765	2.695	0.004	0.045	2.765	83.667	84.174	0.353	0.327	83.667
MARS-WEMA_270041	Managed Drought	2.475	2.682	0.004	0.045	2.475	84.167	84.338	0.353	0.327	84.167
MARS-WEMA_270042	Managed Drought	2.655	2.69	0.004	0.045	2.655	84.167	84.338	0.353	0.327	84.167
MARS-WEMA_270043	Managed Drought	2.645	2.69	0.004	0.045	2.645	83.167	84.009	0.353	0.327	83.167
MARS-WEMA_270044	Managed Drought	2.688	2.692	0.004	0.045	2.688	82.5	83.79	0.353	0.327	82.5
MARS-WEMA_270045	Managed Drought	2.29	2.674	0.004	0.045	2.29	86.333	85.052	0.353	0.327	86.333
MARS-WEMA_270046	Managed Drought	2.535	2.685	0.004	0.045	2.535	83.833	84.229	0.353	0.327	83.833
MARS-WEMA_270047	Managed Drought	2.36	2.677	0.004	0.045	2.36	83.333	84.064	0.353	0.327	83.333
MARS-WEMA_270048	Managed Drought	2.878	2.7	0.004	0.045	2.878	86.167	84.997	0.353	0.327	86.167
MARS-WEMA_270049	Managed Drought	2.815	2.697	0.004	0.045	2.815	82.333	83.735	0.353	0.327	82.333
MARS-WEMA_270050	Managed Drought	2.24	2.671	0.004	0.045	2.24	86	84.942	0.353	0.327	86
MARS-WEMA_270051	Managed Drought	2.535	2.685	0.004	0.045	2.535	82.5	83.79	0.353	0.327	82.5
MARS-WEMA_270052	Managed Drought	2.718	2.693	0.004	0.045	2.718	83.167	84.009	0.353	0.327	83.167
MARS-WEMA_270053	Managed Drought	2.518	2.684	0.004	0.045	2.518	85.5	84.777	0.353	0.327	85.5
MARS-WEMA_270054	Managed Drought	2.505	2.683	0.004	0.045	2.505	85.333	84.723	0.353	0.327	85.333
MARS-WEMA_270055	Managed Drought	2.378	2.678	0.004	0.045	2.378	87	85.271	0.353	0.327	87
MARS-WEMA_270056	Managed Drought	2.498	2.683	0.004	0.045	2.498	85	84.613	0.353	0.327	85
MARS-WEMA_270057	Managed Drought	2.333	2.675	0.004	0.045	2.333	86.833	85.216	0.353	0.327	86.833
MARS-WEMA_270058	Managed Drought	2.13	2.666	0.004	0.045	2.13	86.333	85.052	0.353	0.327	86.333
MARS-WEMA_270059	Managed Drought	2.538	2.685	0.004	0.045	2.538	83.833	84.229	0.353	0.327	83.833
MARS-WEMA_270060	Managed Drought	2.345	2.676	0.004	0.045	2.345	83.167	84.009	0.353	0.327	83.167
1ARS-WEMA_270061	Managed Drought	2.75	2.694	0.004	0.045	2.75	83.5	84.119	0.353	0.327	83.5
MARS-WEMA_270062	Managed Drought	2.777	2.695	0.004	0.045	2.777	83.333	84.064	0.353	0.327	83.333
MARS-WEMA_270063	Managed Drought	2.738	2.694	0.004	0.045	2.738	84.5	84.448	0.353	0.327	84.5
MARS-WEMA_270064	Managed Drought	2.728	2.693	0.004	0.045	2.728	85	84.613	0.353	0.327	85





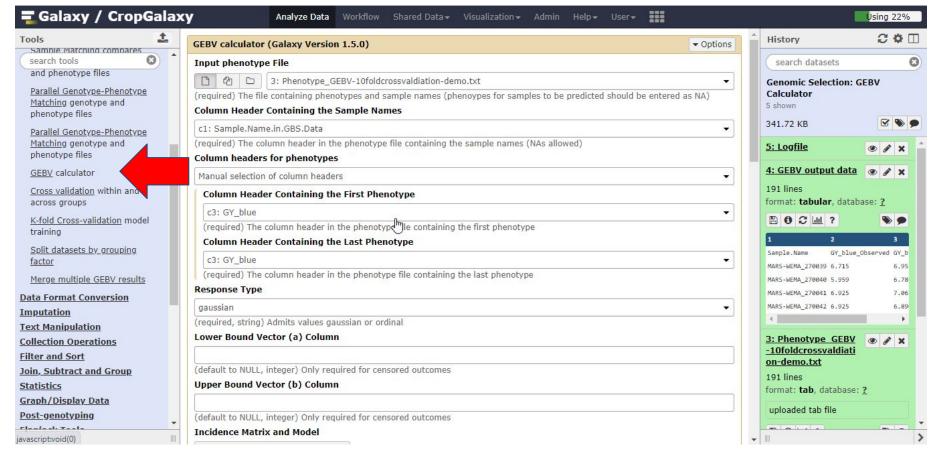






B. Genomic Breeding Values (GEBV) calculator

- Samples have been genotyped but no phenotypic data
- Predict GEBV based on phenotypes and marker effects identified in the training dataset
- Input:
 - Genotype matrix
 - Phenotyping File
- Output:
 - Table of observed and predicted values for each trait

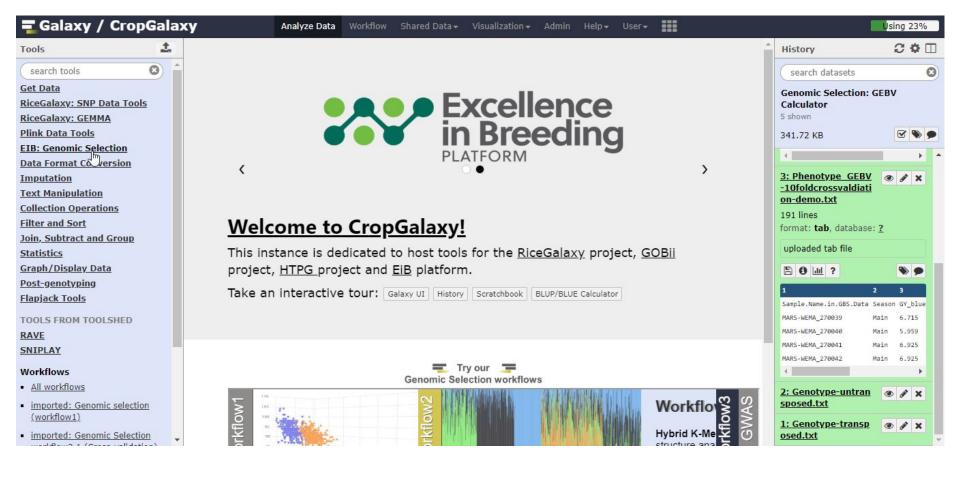


GEBV calculator





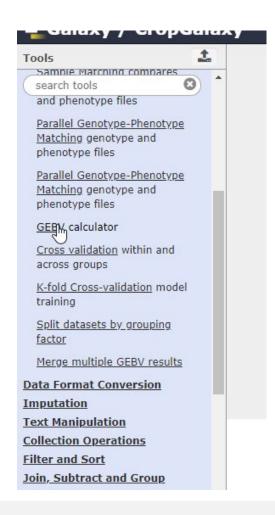
- 1. Dataset:
 - a. Shared Data-> Data Libraries-> Test
 Dataset-> Genomic Selection-> GEBV
 - b. Select all datasets.
 - c. Import to History.
 - d. Click Green pop-up to start analyzing it.







- 2. Tool:
- a. Go to Tools-> EIB: Genomic Selection->GEBV calculator





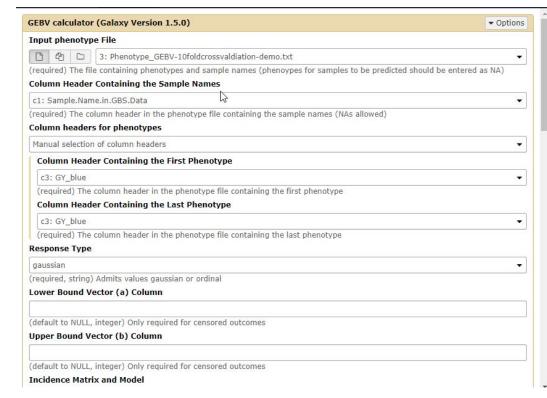
3. GEBV Calculator

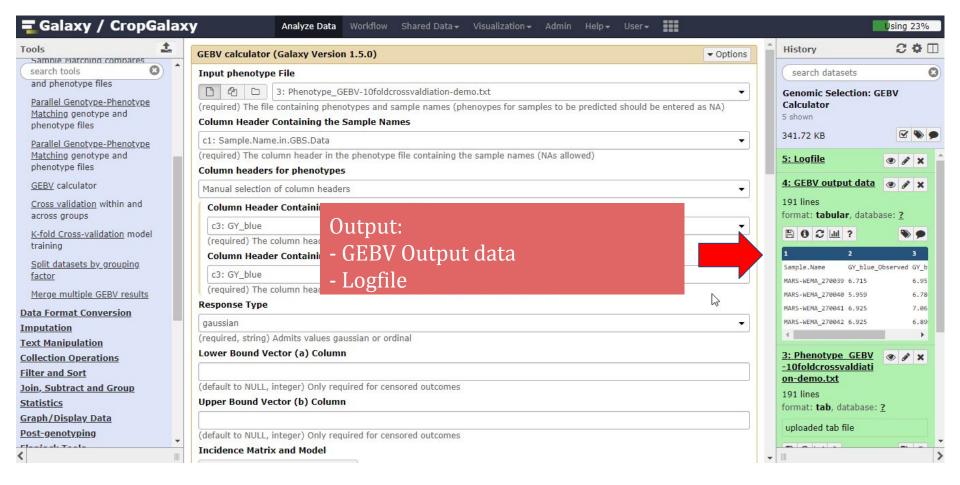
Input phenotype data:

Phenotype_GEBV-10fold crossvaldiation-demo.txt

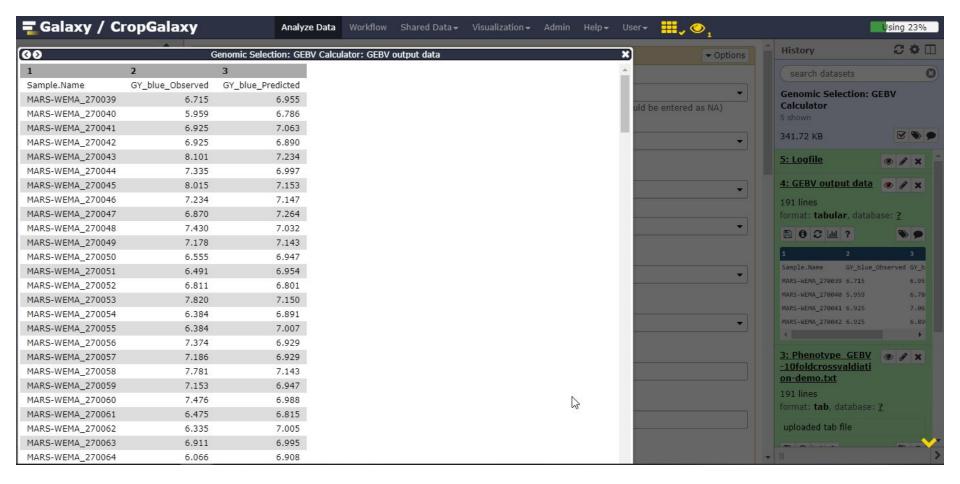
Incidence Matrix:

Genotype-transposed.txt











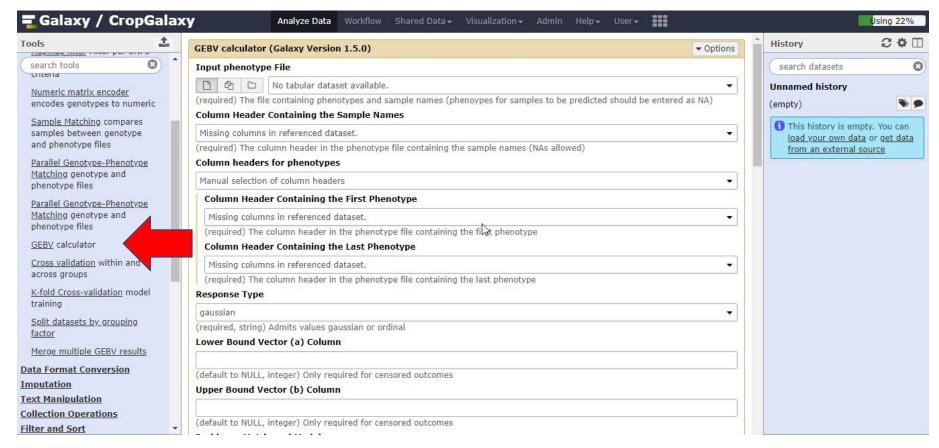




C. Cross Validation (within and across groups)

applied to estimate how the model will perform in general

IRRI



Cross Validation





- 1. Dataset:
 - a. Shared Data-> Data Libraries-> Test
 Dataset-> Genomic Selection-> Cross
 Validation
 - b. Select all datasets.
 - c. Import to History.
 - d. Click Green pop-up to start analyzing it.



IRRI

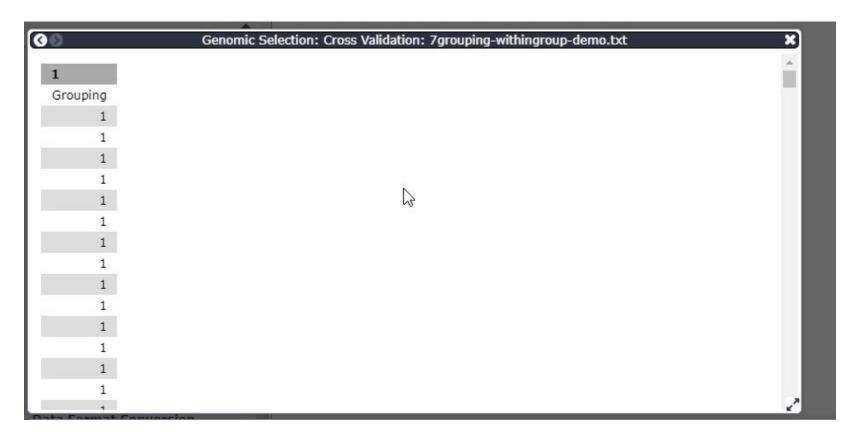
╤ Galaxy / CropGalaxy				Analyze Data	a Workflo	w Shared	l Data →	Visualization → Adn	nin Help+	User →				Using 23%		
Tools	±	1	2	3	4	5	6	7	8	9	10	11	History	2 0		
search tools	Dares	is_added	gid	Grouping	GY_blue	GY_blup	GY_PEV	GY_pevReliability	GY_means	Phenotype	Group Mean	Ad	search datasets	9		
and phenotype files		1	49307	1	NA	NA	NA	NA	NA	NA						
Parallel Genotype-Pher	notyne	0	49308	1	6.465	6.928	0.282	0.311	6.465	0.463	7.138235294		Genomic Selection: Cr	055		
Matching genotype and		0	49309	1	7.09	7.123	0.282	0.311	7.09	0.033			Validation 8 shown			
phenotype files		0	49310	1	9.335	7.823	0.282	0.311	9.335	-1.512				C 80		
Parallel Genotype-Pher	notype	1	49311	1	NA	NA	NA	NA	NA	NA			19.66 MB	☑ 🌑		
Matching genotype and	CONTROL OF	1	49312	1	NA	NA	NA	NA	NA	NA			02?			
phenotype files		0	49313	1	8.67	7.616	0.282	0.311	8.67	-1.054			001			
GEBV calculator		0	49314	1	7.235	7.168	0.282	0.311	7.235	-0.067			3: phenotypes-cros	● # ×		
Conse validation within	and	0	49315	1	7.66	7.301	0.282	0.311	7.66	-0.359			svalidation-demo.t	• / X		
Cross validation within and across groups	i anu	1	49316	1	NA	NA	NA	NA	NA	NA			<u>xt</u>			
		0	49317	1	6.805	7.034	0.282	0.311	6.805	0.229			1,331 lines			
K-fold Cross-validation training	model	0	49318	1	6.21	6.849	0.282	0.311	6.21	0.639			format: tab, database:	?		
		0	49319	1	8.895	7.686	0.282	0.311	8.895	-1.209			up oaded tab file			
Split datasets by group	ping	1	49320	1	NA	NA	NA	NA	NA	NA			up oaded tab file			
factor		0	49321	1	9.72	7.944	0.282	0.311	9.72	-1.776			□ 0 111 ?	> 9		
Merge multiple GEBV r	results	0	49322	1	7.585	7.278	0.282	0.311	7.585	-0.307			1 2 3 4	5		
nta Format Conversio	on .	0	49323	1	8.525	7.571	0.282	0.311	8.525	-0.954			is_added gid Grouping GV			
nputation		0	49324	1	6.925	7.072	0.282	0.311	6.925	0.147			1 49307 1 NA			
ext Manipulation		0	49325	1	6.55	6.955	0.282	0.311	6.55	0.405				.465 6.92		
ollection Operations		0	49326	1	7.02	7.101	0.282	0.311	7.02	0.081			0 49309 1 7.	.09 7.12		
Iter and Sort		0	49327	1	6.65	6.986	0.282	0.311	6.65	0.336			0 49310 1 9.	.335 7.82		
oin, Subtract and Gro	up	0	49328	1	6.82	7.039	0.282	0.311	6.82	0.219			1)		
atistics	=	0	49329	1	6.37	6.899	0.282	0.311	6.37	0.529			2: Genotype-transp			
raph/Display Data		0	49330	1	6.845	7.047	0.282	0.311	6.845	0.202			osed-withingroup-c	● 🖋 🗙		
ost-genotyping		0	49331	1	7.595	7.281	0.282	0.311	7.595	-0.314			ross-validation.txt			
ost-genotyping	-	0	49332	1	6.48	6.933	0.282	0.311	6.48	0.453			1. 7			



0					Ge	nomic Se	lection: C	ross Valid	dation: Ge	notype-tr	ansposed	-withingro	oup-cross-	validatio	n.txt					
s145689	rs150	837	rs150	103	rs156	977	rs148	3542	rs148	3897	rs14	3817	rs145	887	rs15	1228	rs145	5371	rs147	7944
s150625	rs150	352	rs150	756	rs147	7050	rs148	3032	rs147	7822	rs14	7397	rs150	156	rs149	9920	rs148	3643	rs146	5762
s151097	rs15	1059	rs150	927	rs145	831	rs145	5474	rs146	5820	rs15	1679	rs147	7597	rs150	0098	rs153	1380	rs147	/122
s147703	rs149	9226	rs146	026	rs150	248	rs145	5610	rs148	8038	rs14	5836	rs147	7977	rs149	9673	rs146	5971	rs149	266
s150677	rs150	0034	rs150	0005	rs149	9940	rs150	9564	rs149	9412	rs15	1680	rs148	3614	rs14	5772	rs147	7873	rs147	/139
s151306	rs14		rs150		rs147		rs14		rs15		rs14		rs146		rs14		rs151		rs150	
145731	rs149		rs150		rs146		rs147		rs15		rs14		rs150		rs14		rs151		rs148	
s146551	rs14		rs148		rs147		rs14		rs14		rs14		rs148		rs14		rs150		rs151	
148731	rs150		rs148		rs156		rs150		rs14		rs148		rs148		rs14		rs147		rs146	
146099	rs14		rs150		rs150		rs14		rs145		rs14		rs147		rs14		rs149		rs151	
147329	rs14		rs145		rs146		rs150		rs149		rs14		rs148		rs15		rs156		rs147	
s150580	rs149		rs145		rs149		rs14		rs149		rs14		rs151		rs14		rs145		rs149	
s145829	rs14		rs145		rs146		rs150		rs150		rs15		rs146		rs14		rs149		rs149	
s147053	rs14		rs147		rs156		rs15		rs149		rs15		rs149		rs14		rs149		rs149	
s151345	rs14		rs145		rs151		rs14		rs149		rs14		rs150		rs14		rs146		rs150	
s148310	rs14		rs149						rs148121 rs146433					rs146081		7692	rs145			
s151419	rs147847 rs151266		rs148	3356	rs14	5867	rs148	8419	rs14	rs145567		rs149222		rs151653		rs146973		7809		
s148598	rs150		rs149											-						
0	1	0	0	0	0	2	1	2	1	2	0	1	0	1	1	1	1	2	0	0
1	0	1	1	1	1	1	0	1	1	2	1	1	0	1	2	0	0	2	1	1
0	2	1	2	0	0	1	1	1	1	0	2	0	1	2	2	2	1	0	2	2
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0	2	2	0	1	1	0	1	1	0	1	1	1	0	1		1	2	2	1	0
1	0	0	1	2	1	2	1	1	1	0	0	1	0	0	1 2	Ø 1	1	1	0	2
2	0	1	0 1	1	2	0	2	0	0	1	1	_	0	0	2	1	0	1	1	0
0	0	0	1	0	2	0	1	1	0	1	2	1		4			4	,	2	
1	0	0	2	0	Ø 1	1	2	2	1	9	1	2	1 0	1	Ø 1	1 2	1 2	1	2	0
1	1	0	1	1	2	0	1	1	2	1	0	0	0	1	9	1	1	1	0	2
2	9	1	0	2	1	1	0	2	0	0	1	1	0	0	1	2	1	0	2	7
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2	0	2	1	2	1	1	0	0	0	1	1	1	0	1	ю	2	0	0	0	1
0							0		0	1	1	1								
0 1	1	0	2	0	1	0	1	0	1	0	1	1	0	1	2	0	1	1	1	2

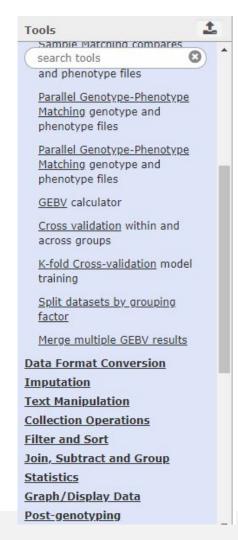








- 2. Tool:
- a. Go to Tools-> EIB: Genomic Selection->Cross Validation





3. Cross Validation

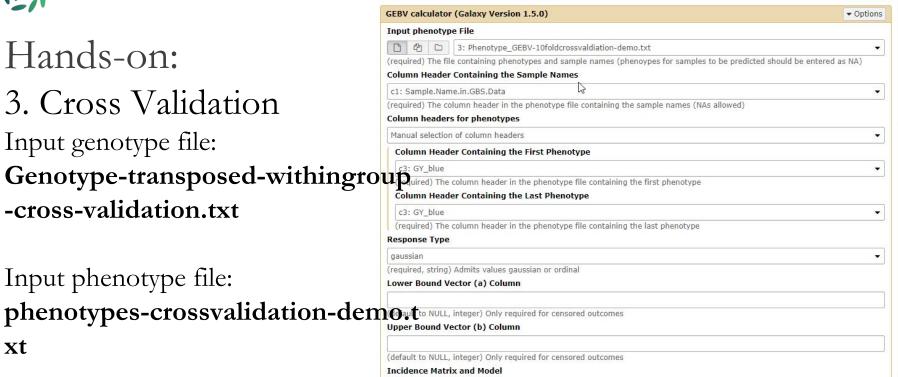
Input genotype file:

-cross-validation.txt

Input phenotype file:

phenotypes-crossvalidation-dem @ to NULL, integer) Only required for censored outcomes

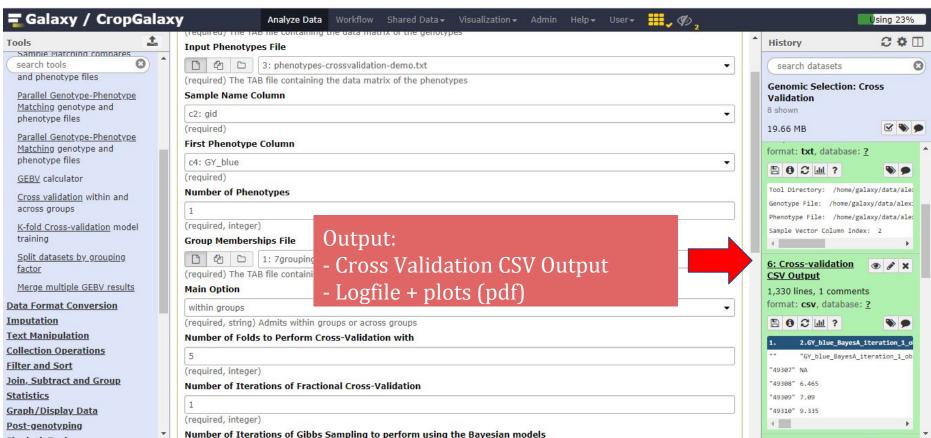
xt



Group Membership file:

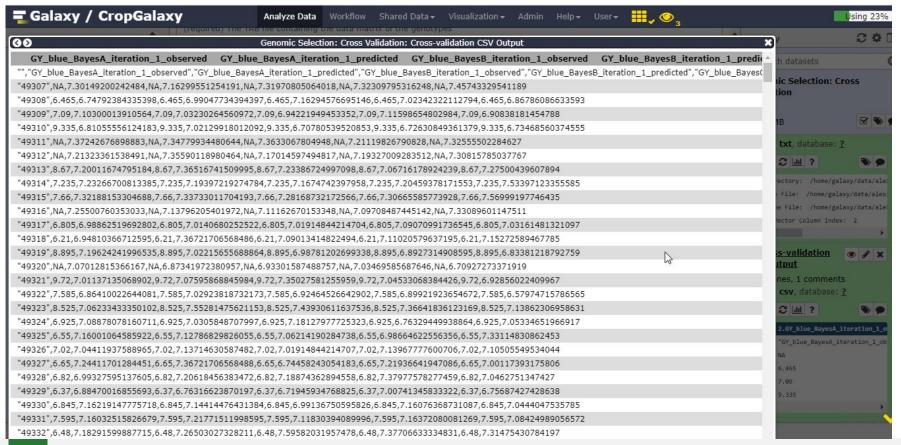
7grouping-withingroup-demo.txt















D. OGHMA Tools

Thank you!

















Thank you!

- Kelly Robbins
- Elizabeth Jones
- Star Xiao Gao
- Mike Olsen
- Susanne Dreisigacker
- JOsh Cobb
- Rajeev Varshney
- Victor Jun Ulat
- Angel Villahoz-Baleta
- Alexis Dereeper
- Umesh Rosyara
- Xuecai Zhang

- Juan Andres Burgueño
- Pancho Crossa
- Kate Dehner
- Manish Roorkiwal
- Hima Kudapa
- Santosh Deshpande
- Paulino Perez
- Fernando Toledo
- Nicolas Beaume
- Ramil Mauleon
- Kenneth McNally
- Dmytro Chebotarov

- Abhishek Rathore
- Jean-Luc Jannink
- Mark Sorrells
- Nickolai Alexandro