Supplemental Figures and Tables

Genomic prediction accounting for genotype by environment interaction offers an effective framework for breeding simultaneously for adaptation to an abiotic stress and performances under normal cropping conditions in rice.

Ben Hassen $M^{*,\dagger,\ddagger\,1}$, Bartholomé $J^{\dagger,\ddagger\,1}$, Valè G^{\S} , Cao $TV^{\dagger,\ddagger\,1}$, Ahmadi $N^{\dagger,\ddagger}$

[†] CIRAD, UMR AGAP, F-34398 Montpellier, France.

[‡] AGAP, Univ Montpellier, CIRAD, INRA, Montpellier SupAgro, Montpellier, France.

[§] CREA- Council for Agricultural Research and Economics, Research Center for Cereal and Industrial Crops, S. S. 11 to Torino Km 2.5, Vercelli, 13100, Italy

¹ These authors have contributed equally to the work

^{*} Corresponding author. nourollah.ahmadi@cirad.fr

The following supporting information is available for this article:

Figure S1: Correlation matrix between performance in each condition (continuous flooding – CF and alternate wetting and drying – AWD) and response variables (response index and slope of the joint regression) for the three traits considered: days to flowering (FL), nitrogen-balance index (NI), and panicle weight (PW). The reference (RP) and progeny (PP) populations are in green and grey, respectively.

Figure S2: Single environment and multi-environment (M1 and M2) predictive abilities in cross validation experiments with 40% of untested entries in the reference population obtained with three statistical models (GBLUP, RKHS-1, RKHS-2). Continuous flooding and alternate wetting and drying water management conditions are in blue and orange, respectively. Three traits are presented: days to flowering (FL), nitrogen balance index (NI) panicle weight (PW). The letters in each panel represent the results of Tukey's HSD comparison of means and apply to each panel independently. The means differ significantly (p-value < 0.05) if two boxplots have no letter in common.

Table S1: Variance components and the associated statistic (F-value for fixed effects and Z-value for random effects) of days to flowering (FL), nitrogen balance index (NI), and panicle weight (PW). Separate analysis of each population and each water management system (continuous flooding – CF and alternate wetting and drying – AWD).

Table S2: Variance components and the associated statistic: F-value for fixed effects and Z-value for random effects) of days to flowering (FL), nitrogen balance index (NI), and panicle weight (PW). Separate analysis of each population pooled over water management conditions (continuous flooding – CF and alternate wetting and drying – AWD).

Table S3: Variance components for the joint regression for days to flowering (FL), nitrogen balance index (NI), and panicle weight (PW). Results are shown for the reference and progeny populations.

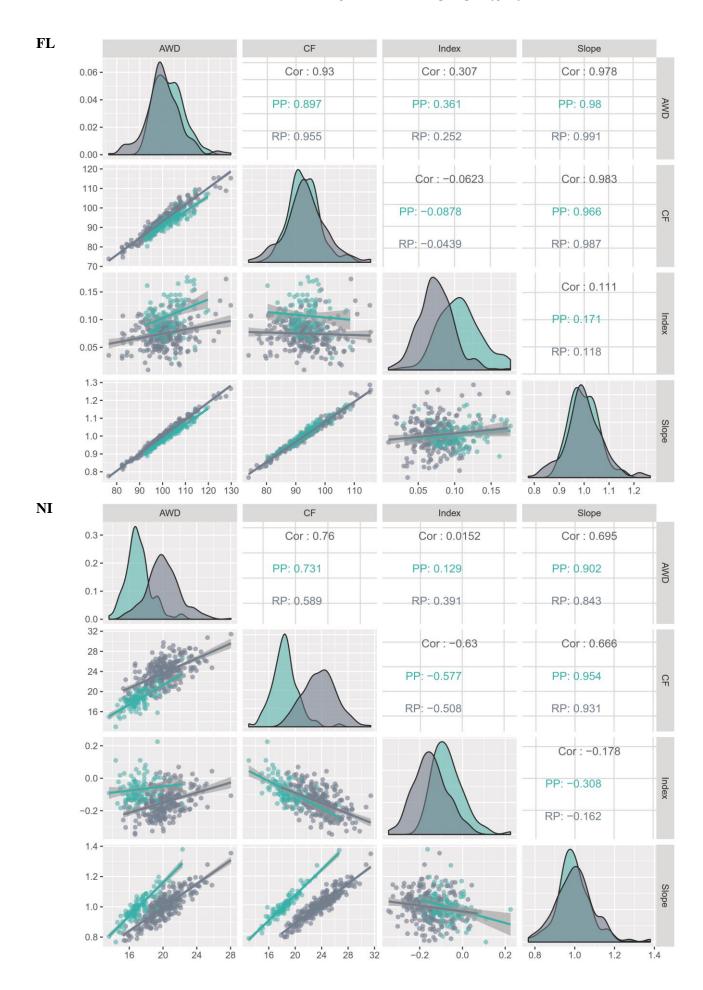
Table S4: Mean genomic predictive abilities in the reference population for the response variables (index and slope) and the performance within each condition (continuous flooding – CF and alternate wetting and drying – AWD). The results for days to flowering (FL), nitrogen balance index (NI) and panicle weight (PW) are presented. Two statistical models (GBLUP and RKHS) were used.

Table S5: Genomic predictive abilities for across population validation for the response variables (index and slope) and the performance within each condition (continuous flooding – CF and alternate wetting and drying – AWD). The scenarios used to define the training set are S1 (only the parents), S2 (100 individuals of the RP selected with CDmean) and S3 (the whole RP). Results for days to flowering (FL), nitrogen balance index (NI) and panicles weight (PW) are presented. Two statistical models (GBLUP and RKHS) were used.

Table S6: Mean genomic predictive ability of the performance within each condition (continuous flooding – CF and alternate wetting and drying – AWD) using single or multi-environment models in the reference population. For multi-environment models, two methods of cross-validation were used: M1 and M2. In addition to genomic predictive ability, the phenotypic predictive ability evaluated as the correlation between the performances in the two conditions using the same random sampling as in M2 cross-validation are provided. Results for days to flowering (FL), nitrogen balance index (NI) and panicle weight (PW) are presented. Two statistical models (GBLUP, RKHS) were used in single environment prediction and three (GBLUP, RKHS-1 and RKHS-2) in multi-environment prediction.

Table S7: Genomic predictive abilities of the performance within each condition (continuous flooding – CF and alternate wetting and drying – AWD) using single or multi-environment models for across population validation. The scenarios used to define the training set are S1 (only the parents), S2 (100 individuals of the RP selected with CDmean) and S3 (the whole RP). Results for days to flowering (FL), nitrogen balance index (NI) and panicle weight (PW) are presented. Two statistical models (GBLUP,

RKHS) were used in single environment prediction and three (GBLUP, RKHS-1 and RKHS-2) in multi-environment prediction.



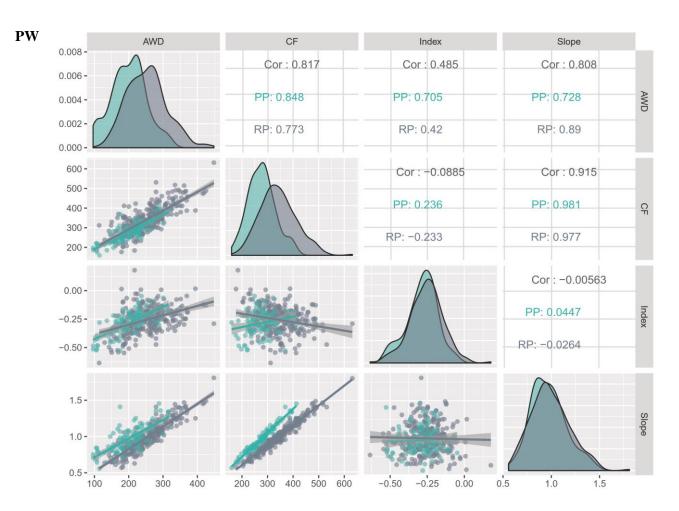


Figure S1: Correlation matrix between performance in each condition (continuous flooding – CF and alternate wetting and drying – AWD) and response variables (response index and slope of the joint regression) for the three traits considered: days to flowering (FL), nitrogen-balance index (NI), and panicle weight (PW). The reference (RP) and progeny (PP) populations are in green and grey, respectively.

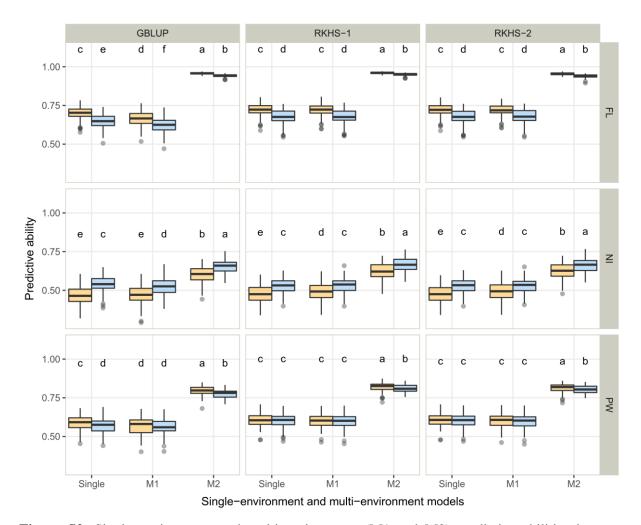


Figure S2: Single environment and multi-environment (M1 and M2) predictive abilities in cross validation experiments with 40% of untested entries in the reference population obtained with three statistical models (GBLUP, RKHS-1, RKHS-2). Continuous flooding and alternate wetting and drying water management conditions are in blue and orange, respectively. Three traits are presented: days to flowering (FL), nitrogen balance index (NI) panicle weight (PW). The letters in each panel represent the results of Tukey's HSD comparison of means and apply to each panel independently. The means differ significantly (p-value < 0.05) if two boxplots have no letter in common.

Table S1: Variance components and the associated statistic (F-value for fixed effects and Z-value for random effects) of days to flowering (FL), nitrogen balance index (NI), and panicle weight (PW). Separate analysis of each population and each water management system (continuous flooding – CF and alternate wetting and drying – AWD).

Population	Trait	Condition	Fixed / Random	Source	Estimate	Standard error of the estimate	F or Z statistic	p-value
-			Fixed	Year			1700.49	<.0001
		AWD		Genotype	57.6813	5.5461	10.4	<.0001
		AWD	Random	Year * Genotype	10.9007	1.2604	8.65	<.0001
	FL ·			Residual	11.2789	0.4755	10.4 <.0001	
	1 L		Fixed	Year				
		CF		Genotype	47.7834	4.2925		
			Random	Year * Genotype	4.3612	0.5405		
			Fixed	Residual Year	5.9523	0.2501		
			rixeu	Genotype	4.9925	0.7344		
		AWD	Random	Year * Genotype	1.2169	0.568		
			Random	Residual	14.7108	0.6268		
Reference	NBI -		Fixed	Year	11.7100	0.0200		
		CE		Genotype	6.1702	1.0147		
		CF	Random	Year * Genotype	4.0852	0.8514	4.8	<.0001
				Residual	16.7468	0.7088	23.63	<.0001
		AWD	Fixed	Year				
			Random	Genotype	3435.39	390.5		
				Year * Genotype	949.48	189.58		
	PW			Residual	3142.66	140.95		
	2 ,,		Fixed	Year	#000 0# #0# 4			
		CF	D 1	Genotype	5088.95	505.4	39.66 <.0001	
			Random	Year * Genotype	850.38	150.39		
-				Residual Year	2437.24	105.68		
		AWD	Fixed	Repetition				
			Random	Genotype	35.1488	6.0138		
				Year * Genotype	8.1658	1.7861		
	FL -			Residual	11.7835	0.8574		
			Fixed	Year				
				Repetition(Year)			7.84	<.0001
		CF		Genotype	23.1957	3.9792		<.0001
			Random	Year * Genotype	7.3783	1.1809		
				Residual	2.2718	0.1648		
			Fixed	Year				
		ANNE		Repetition(Year)	2.0271	0.57.62		
		AWD	Dandam	Genotype	3.0271	0.5762	5.25	<.0001
			Random	Year * Genotype Residual	0 5.3244	0.3545	15.02	< 0001
Progeny	NBI -			Year	3.3244	0.3343		
			Fixed	Repetition(Year)				
		CF		Genotype	4.1183	0.7624	5.4	<.0001
		01	Random	Year * Genotype	0.696	0.3059	2.28	0.0114
				Residual	3.7236	0.2808	13.26	<.0001
			Di 4	Year			224.57	<.0001
			Fixed	Repetition(Year)			36.36	<.0001
		AWD		Genotype	2487.8	408.02	6.1	<.0001
			Random	Year * Genotype	466.32	93.7984	4.97	<.0001
	PW -			Residual	522.24	37.9339	13.77	<.0001
	,		Fixed	Year			19.33	<.0001
		CE.		Repetition(Year)	2600.52	425.10	51.44	<.0001
		CF	Dond	Genotype	2698.52	435.18	6.2	<.0001
			Random	Year * Genotype	415.49 554	88.7666 40.3073	4.68	<.0001
-				Residual	554	40.3973	13.71	<.0001

Table S2: Variance components and the associated statistic: F-value for fixed effects and Z-value for random effects) of days to flowering (FL), nitrogen balance index (NI), and panicle weight (PW). Separate analysis of each population pooled over water management conditions (continuous flooding – CF and alternate wetting and drying – AWD).

Population	Trait	Fixed / Random	Source	Estimate	Standard error of the estimate	F or Z statistic	Respective p-value
			Year			1634.20	<.0001
		Fixed	Condition			2294.10	<.0001
			Condition*Year			731.78	<.0001
	FL		Genotype	52.01	4.73	10.99	<.0001
	LL		Year*Genotype	5.19	0.70	7.40	<.0001
		Random	Condition*Genotype	0.32	0.35	0.91	0.1805
Reference			Condition*Year*Genotype	2.49	0.47	5.31	<.0001
			Residual	8.63	0.26	33.53	<.0001
			Year			2.06	0.1526
		Fixed	Condition			476.53	<.0001
			Condition*Year			217.82	<.0001
	NBI		Genotype	4.66	0.70	6.62	<.0001
	MDI		Year*Genotype	1.83	0.49	3.74	<.0001
		Random	Condition*Genotype	0.92	0.43	2.16	0.0155
			Condition*Year*Genotype	0.81	0.54	1.49	0.068
			Residual	15.75	0.47	33.28	<.0001
			Year			36.59	<.0001
		Fixed	Condition			914.07	<.0001
	PW		Condition*Year			212.19	<.0001
		Random	Genotype	3961.99	395.27	10.02	<.0001
	PW		Year*Genotype	15.53	118.61	0.13	0.4479
			Condition*Genotype	312.42	135.38	2.31	0.0105
			Condition*Year*Genotype	869.37	167.40	5.19	<.0001
			Residual	2787.24	87.08	32.01	<.0001
			Year			843.72	<.0001
		Ti 4	Rep(Year)			8.25	<.0001
		Fixed	Condition			1168.88	<.0001
			Condition*Year			23.54	<.0001
	FL		Genotype	27.46	4.69	5.86	<.0001
			Year*Genotype	5.30	1.17	4.51	<.0001
		Random	Condition*Genotype	1.68	0.69	2.45	0.0072
			Condition*Year*Genotype	2.49	0.71	3.51	0.0002
			Residual	7.01	0.36	19.52	<.0001
			Year			268.27	<.0001
		Ti 4	Rep(Year)			8.56	<.0001
		Fixed	Condition			85.02	<.0001
			Condition*Year			22.22	<.0001
Progeny	NBI		Genotype	3.25	0.59	5.48	<.0001
			Year*Genotype	0.32	0.17	1.81	0.0352
		Random	Condition*Genotype	0.32	0.18	1.79	0.037
			Condition*Year*Genotype	0.00			
			Residual	4.78	0.24	19.91	<.0001
			Year			47.35	<.0001
		E: 1	Rep(Year)			64.92	<.0001
		Fixed	Condition			689.06	<.0001
			Condition*Year			261.44	<.0001
	PW		Genotype	2394.72	390.55	6.13	<.0001
			Year*Genotype	163.54	66.14	2.47	0.0067
		Random	Condition*Genotype	194.30	69.46	2.80	0.0026
			Condition*Year*Genotype	260.52	67.47	3.86	<.0001
			Residual	584.89	30.06	19.45	<.0001

Table S3: Variance components for the joint regression for days to flowering (FL), nitrogen balance index (NI), and panicle weight (PW). Results are shown for the reference and progeny populations.

		Joint		Standard	Z	_	Confidence limits	
Population	Trait	regression parameters	Estimates	error of the estimates	statistics	p-values	Lower	Upper
	FL	μ_{i}	0					_
	FL	eta_{i}	1.0055	0.08439	11.91	<.0001	0.8586	1.1938
Reference	NI	$\mu_{\mathbf{i}}$	0					
Reference	NI	β_{i}	1.0063	0.08462	11.89	<.0001	0.859	1.1951
	PW	$\mu_{ m i}$	357.34	2651.71	0.13	0.4464	39.2821	1.89E+89
	PW	β_{i}	1.0327	0.09148	11.29	<.0001	0.8745	1.2383
	FL	$\mu_{\rm i}$	0					
	FL	β_{i}	1.003	0.144	6.96	<.0001	0.7712	1.3581
D	NI	μ_{i}	0					
Progeny	NI	β_{i}	1.007	0.1448	6.95	<.0001	0.7741	1.3641
	PW	μ_{i}	2033.77	2511.54	0.81	0.209	457.74	432973
	PW	β_{i}	1.0045	0.1504	6.68	<.0001	0.7644	1.3792

Table S4: Mean genomic predictive abilities in the reference population for the response variables (index and slope) and the performance within each condition (continuous flooding – CF and alternate wetting and drying – AWD). The results for days to flowering (FL), nitrogen balance index (NI) and panicle weight (PW) are presented. Two statistical models (GBLUP and RKHS) were used.

-				NT	r	DV	K 7
Phenotype	Model	FL		N.	L	PW	
Thenotype	Model	Mean	SE	Mean	SE	Mean	SE
Index	GBLUP	0.29	0.12	0.21	0.11	0.43	0.10
Index	RKHS	0.30	0.13	0.17	0.12	0.48	0.09
Slope	GBLUP	0.69	0.08	0.59	0.08	0.62	0.07
Slope	RKHS	0.72	0.08	0.59	0.08	0.64	0.07
AWD	GBLUP	0.71	0.08	0.47	0.10	0.62	0.07
AWD	RKHS	0.74	0.08	0.48	0.09	0.63	0.06
CF	GBLUP	0.66	0.08	0.56	0.08	0.59	0.08
CF	RKHS	0.70	0.08	0.55	0.08	0.62	0.07

Table S5: Genomic predictive abilities for across population validation for the response variables (index and slope) and the performance within each condition (continuous flooding – CF and alternate wetting and drying – AWD). The scenarios used to define the training set are S1 (only the parents), S2 (100 individuals of the RP selected with CDmean) and S3 (the whole RP). Results for days to flowering (FL), nitrogen balance index (NI) and panicles weight (PW) are presented. Two statistical models (GBLUP and RKHS) were used.

Phenotype	Scenario	Model	FL	NI	PW
	C1	GBLUP	0.24	0.16	0.17
	S 1	RKHS	0.15	-0.10	0.14
Index	S2	GBLUP	-0.01	0.04	0.19
muex	32	RKHS	0.00	-0.06	0.15
	S 3	GBLUP	0.24	0.17	0.17
_	33	RKHS	0.21	0.12	0.25
	S1	GBLUP	0.30	0.25	0.51
	31	RKHS	0.38	0.04	0.56
Slope	S2	GBLUP	0.20	0.35	0.32
Stope		RKHS	0.22	0.36	0.32
	S 3	GBLUP	0.32	0.43	0.45
_		RKHS	0.37	0.45	0.52
	S 1	GBLUP	0.32	0.25	0.51
		RKHS	0.37	0.03	0.54
AWD	S2	GBLUP	0.23	0.27	0.39
AWD	52	RKHS	0.25	0.24	0.40
	S 3	GBLUP	0.34	0.36	0.42
<u>-</u>		RKHS	0.37	0.38	0.49
	S1	GBLUP	0.27	0.19	0.48
	51	RKHS	0.37	-0.03	0.56
CF	S2	GBLUP	0.14	0.27	0.28
CI	32	RKHS	0.16	0.29	0.31
	S 3	GBLUP	0.28	0.39	0.42
	33	RKHS	0.36	0.41	0.52

Table S6: Mean genomic predictive ability of the performance within each condition (continuous flooding – CF and alternate wetting and drying – AWD) using single or multi-environment models in the reference population. For multi-environment models, two methods of cross-validation were used: M1 and M2. In addition to genomic predictive ability, the phenotypic predictive ability evaluated as the correlation between the performances in the two conditions using the same random sampling as in M2 cross-validation are provided. Results for days to flowering (FL), nitrogen balance index (NI) and panicle weight (PW) are presented. Two statistical models (GBLUP, RKHS) were used in single environment prediction and three (GBLUP, RKHS-1 and RKHS-2) in multi-environment prediction.

Canditions	Т	Madal	FL	FL		NI		PW	
Conditions	Type	Model	Mean	SE	Mean	SE	Mean	SE	
	Cinala	GBLUP	0.71	0.08	0.47	0.1	0.61	0.07	
	Single	RKHS	0.74	0.08	0.48	0.09	0.63	0.06	
		GBLUP	0.67	0.08	0.48	0.1	0.6	0.07	
AWD	M1	RKHS-1	0.74	0.08	0.5	0.1	0.63	0.06	
AWD		RKHS-2	0.73	0.08	0.5	0.09	0.63	0.07	
	M2	GBLUP	0.96	0.01	0.59	0.09	0.8	0.04	
		RKHS-1	0.96	0.01	0.62	0.09	0.84	0.04	
		RKHS-2	0.96	0.01	0.62	0.09	0.83	0.04	
	Phe	notype	0.96	0.01	0.57	0.1	0.78	0.05	
	Single	GBLUP	0.66	0.08	0.56	0.08	0.59	0.08	
		RKHS	0.7	0.08	0.55	0.08	0.62	0.07	
		GBLUP	0.63	0.09	0.54	0.09	0.59	0.08	
CF	M1	RKHS-1	0.69	0.08	0.55	0.09	0.62	0.07	
Cr		RKHS-2	0.69	0.09	0.55	0.08	0.61	0.07	
		GBLUP	0.95	0.01	0.65	0.07	0.78	0.04	
	M2	RKHS-1	0.95	0.01	0.66	0.07	0.82	0.04	
		RKHS-2	0.95	0.01	0.66	0.07	0.82	0.04	
	Phe	notype	0.95	0.01	0.58	0.09	0.77	0.06	

Table S7: Genomic predictive abilities of the performance within each condition (continuous flooding – CF and alternate wetting and drying – AWD) using single or multi-environment models for across population validation. The scenarios used to define the training set are S1 (only the parents), S2 (100 individuals of the RP selected with CDmean) and S3 (the whole RP). Results for days to flowering (FL), nitrogen balance index (NI) and panicle weight (PW) are presented. Two statistical models (GBLUP, RKHS) were used in single environment prediction and three (GBLUP, RKHS-1 and RKHS-2) in multi-environment prediction.

Condition	Scenario	Model	Type	FL	NI	PW
		GBLUP	Single	0.32	0.252	0.513
		GBLUP	Multi	0.307	0.362	0.435
	S 1	RKHS	Single	0.365	0.027	0.537
		RKHS-1	Multi	0.379	0.036	0.521
		RKHS-2	Multi	0.375	0.087	0.546
		GBLUP	Single	0.227	0.268	0.391
		GBLUP	Multi	0.284	0.338	0.255
AWD	S2	RKHS	Single	0.248	0.239	0.398
		RKHS-1	Multi	0.259	0.301	0.333
		RKHS-2	Multi	0.281	0.293	0.36
		GBLUP	Single	0.339	0.364	0.423
	S3	GBLUP	Multi	0.358	0.418	0.338
		RKHS	Single	0.371	0.379	0.494
		RKHS-1	Multi	0.389	0.439	0.463
		RKHS-2	Multi	0.387	0.462	0.478
	S 1	GBLUP	Single	0.269	0.189	0.48
		GBLUP	Multi	0.199	0.196	0.504
		RKHS	Single	0.369	-0.034	0.562
		RKHS-1	Multi	0.356	-0.031	0.57
		RKHS-2	Multi	0.356	-0.029	0.578
	-	GBLUP	Single	0.144	0.271	0.282
		GBLUP	Multi	0.202	0.316	0.306
CF	S2	RKHS	Single	0.158	0.285	0.314
		RKHS-1	Multi	0.168	0.33	0.322
		RKHS-2	Multi	0.184	0.312	0.347
		GBLUP	Single	0.284	0.391	0.417
		GBLUP	Multi	0.295	0.324	0.443
	S 3	RKHS	Single	0.362	0.405	0.517
		RKHS-1	Multi	0.354	0.362	0.516
		RKHS-2	Multi	0.36	0.389	0.526