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# On-farm performance of genetically-improved rohu (*Labeo rohita*) in Bangladesh

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**Introduction:** Rohu (*Labeo rohita* Hamilton) is a globally significant aquaculture species for which genetically improved strains are increasingly available. In 2020, a multiplier population, comprised of highly-ranked generation-three (G3) families from the WorldFish Rohu Genetic Improvement Program, was released to hatcheries in Bangladesh for development into broodstock.

**Methods:** To estimate realised genetic gain for harvest weight in the G3-multiplier population, one pond from each of 19 Bangladeshi semi-commercial farms (ten in Jashore and nine in Natore–Rajshahi districts) were stocked with equal numbers of tagged fish from each of three strains. Strains included in the study were the ‘G3-multiplier’ released to hatcheries, a ‘control’ (putatively genetically equivalent to the unimproved base population which was spawned from fish of river origin) and fish sourced from a ‘commercial’ hatchery. Once stocked, fish were managed according to each farmer’s normal practices.

**Results:** The G3-multiplier was found to be the most rapidly growing strain. Back-transformed means for harvest weight across farms for the commercial, control and G3-multiplier strains were 594 g, 659 g and 914 g, respectively, in Jashore, and 545 g, 626 g and 845 g in Natore–Rajshahi.

**Discussion:** These results equate to realised genetic gains of 38.6% (Jashore) and 34.9% (Natore–Rajshahi) for the G3-multiplier over the control strain and provide evidence that a family-based (i.e. pedigree-based) approach to genetic improvement is able to generate substantial levels of genetic gain in rohu. Furthermore, the clear growth advantages exhibited by the G3-multiplier strain over the control and commercial strains in this study, should encourage more Bangladeshi hatcheries, nurseries and farmers to adopt genetically improved rohu.

## KEYWORDS

rohu, *Labeo rohita*, cyprinidae, Indian major carp, genetic improvement program, growth rate, harvest weight, realised genetic gain

## Introduction

Rohu (*Labeo rohita* Hamilton) is a cyprinid (i.e. carp) species and a member of the Indian major carps. The natural distribution of the species encompasses rivers in Bangladesh, India, Myanmar, Nepal and Pakistan (Jhingran and Pullin, 1985). It is a globally significant aquaculture species with over 2.0 Mt produced annually and, in Bangladesh, it is the most abundantly cultured carp species with 386 thousand tonnes produced over 12 months in 2019–2020 (DoF, 2020; FAO, 2020).

Rohu is almost exclusively farmed in polyculture. Polyculture systems efficiently utilise different spatial and trophic levels in ponds by stocking complimentary filter-feeding, herbivorous and bottom feeding species (Rahman et al., 1992; Wahab et al., 2011). Carp polyculture systems adopted in Bangladesh are diverse in terms of scale, intensity, species combinations, and targeted harvest age and weight (Wahab et al., 2011; Belton and Azad, 2012). Historically, low-input polyculture systems have been adopted in Bangladesh. These systems primarily rely on natural food production, generally enhanced through the application of organic or synthetic fertilizers. However, more intensive forms of production, involving supplementary feeding with locally-acquired and/or specialized formulated feeds, are increasingly adopted (Belton and Azad, 2012).

The Jashore District of Khulna Division (herein referred to as the Jashore region), and the Natore and Rajshahi Districts of the Rajshahi Division (herein referred to as the Natore–Rajshahi region) are important rohu growing areas in Bangladesh – they produce 7.3% (21,755 t) and 9.8% (29,335 t) of Bangladeshi pond-cultured rohu, respectively (DoF, 2020), while representing only 1.7% and 2.9% of the country by area. However, the two regions differ in climate (Rashid, 2019) and dominant carp polyculture practices. Natore–Rajshahi farms were located in the hottest and driest area of Bangladesh, the Western Dry climatic sub-region, which generally experiences mean summer maxima above 35°C, annual rainfall below 1524 mm and summer humidity less than 50%. The Jashore farms were located in the South-Western climatic sub-region, which experiences less extreme temperatures (mean summer maxima below 35°C), tempered by greater annual rainfall (1524 – 1778 mm) (Rashid, 2019). A specialized carp polyculture system is commonly practiced in the Natore–Rajshahi region, whereby farmers stock large fish (e.g. 500 g to 1 kg) at low density which are then grown out for extended periods to obtain greater weights (e.g. 3 to 5 kg) and premium prices. Carp aquaculture practices in Jashore region are similar to the practices followed in most other parts of the country, with fish generally harvested between 12 and 24 months of age at between 1 and 2 kg.

In Bangladesh and elsewhere, suboptimal genetic management of hatchery broodstock and a lack of genetically improved strains has historically resulted in the dissemination of

rohu seed exhibiting poor performance (Reddy et al., 2002; Mahapatra et al., 2016; Khan et al., 2018; Sah et al., 2018; Vadhel et al., 2020). To address these issues, the WorldFish Rohu Genetic Improvement Program (WFRGIP) was initiated with the spawning of a base population in 2014. The WFRGIP has subsequently been managed as a family-based (i.e. pedigree-based) program with discrete generations – generation one (G1) was spawned in 2016, G2 in 2018 and G3 in 2020/21 – and selection based on harvest-age body weight (Keus et al., 2017; Hamilton et al., 2019b; Hamilton et al., 2022). To date three lines have been maintained within the WFRGIP – a positively selected line, a control line (putatively genetically equivalent to the base population which was spawned from fish of river origin) and a negatively selected line (not relevant to the current study) (Hamilton et al., 2022).

In 2020, a multiplier population comprised of highly-ranked WorldFish G3 rohu families was released to hatcheries in Bangladesh for development into broodstock. These G3-multiplier broodstock were spawned in commercial hatcheries for the first time in mid-2022.

The primary objective of this study was to quantify the magnitude of the realised genetic response to selection for harvest weight in the WFRGIP (i.e. realised genetic gain; Gjedrem and Baranski, 2009) in two regions of Bangladesh by comparing the performance of the G3-multiplier strain, grown under 'real-world' conditions on Bangladeshi farms, against fish from the WorldFish control line and a well-regarded commercial strain. Realised genetic gains represent gains from genetic improvement programs expressed in operational farms – in contrast with genetic gains estimated from trials in which the environment and management regimes are explicitly defined and controlled, but are not necessarily representative of targeted grow out systems (Hamilton et al., 2023).

## Methods

### Parent selection and spawning

Three strains of rohu were spawned within one day of each other in 2020. The generation-three multiplier (G3-multiplier) and control strains were spawned on the 9<sup>th</sup> of July at the WorldFish Carp Genetic Improvement Program (WFCGIP) facility, near Jashore, Bangladesh. Families contributing to the G3-multiplier and control strains were generated as part of routine genetic improvement activities (Hamilton et al., 2022). Families were made and maintained in separate upwelling hatching jars with mesh at the top to prevent the loss of eggs (i.e. one family per jar). Approximately 30 hours after hatching, fry from full-sib families were pooled to produce the G3-multiplier and control strains and transferred to hapas (i.e. nets) constructed of saree cloth (~300  $\mu$ m mesh).

The 'G3-multiplier strain' was comprised of fish from 14 high-ranking full-sib families. The parents of these G3 families were selected on the basis of having a high estimated total additive genetic value – the sum of the estimated genetic group effect and estimated breeding value (EBV) (Wolak and Reid, 2017) – for harvest weight within the G2 positively-selected line. Furthermore, all parents were from different G2 families, to minimise relationships between individuals in the G3-multiplier and inbreeding in the progeny of the G3-multiplier (the expected level of inbreeding [Wright's inbreeding coefficient;  $F$ ] in the progeny of the G3-multiplier strain is 0.029).

The 'control strain' was comprised of fish from six full-sib families in the WFRGIP G3 control line and parents were selected on the basis of having an estimated total additive genetic value for harvest weight close to zero. Accordingly, the control strain is putatively genetically equivalent to the WFRGIP base population, which was spawned from river-sourced founders (Hamilton et al., 2019b; Hamilton et al., 2022).

The 'commercial strain' was spawned one day earlier than the G3-multiplier and control strains by a well-regarded commercial spawn producer. The commercial strain was derived from a mass spawning of five males and five females – the genetic relationships between these parents was unknown. The commercial strain was transported to the WorldFish Carp Genetic Improvement (WFCGIP) facility at five days of age. Upon arrival, the commercial strain was held in a separate pond to the G3-multiplier and control strains to allow observation and screening for key pathogens, before being transferred to nursing hapas at eleven days of age.

## Nursing

Fish were nursed in suspended hapas according to a randomized complete block design with 18 replicates (i.e. 54 hapas in total). Hapas were of the same dimensions as those used for routine family nursing in the WFRGIP (5.2 x 1.8 x 0.9 m) and each hapa was initially stocked with 1.5 g of hatchlings (Hamilton et al., 2022). Hapas were regularly cleaned and mesh size was progressively increased over the nursing phase – initially to mosquito netting (~1.4 mm; at 39-40 days of age) and ultimately to polyfilament netting (~5 mm; at 61-63 days of age). Once large enough (at 164-175 days of age), fingerlings were tagged with passive integrated transponder (PIT) tags and communally reared in a single pond.

Stocking density during nursing in hapas can affect growth rate (Hamilton et al., 2022). Accordingly, excess fish were removed from the hapas on three occasions during the nursing phase to ensure approximately equal numbers of fish were retained for each strain within a given replicate (Supplementary Material 1). Firstly, at the time of transfer from 300  $\mu$ m to 1.4 mm hapas, the total weight of fry was determined in each hapa, the hapa with the lowest total weight in

each replicate was identified and the weight of fry in the two other hapas was reduced to this weight. Secondly, soon after transfer to 5 mm hapas (at 90-92 days of age), the number of fingerlings in each hapa was counted, the hapa with the lowest number of fingerlings in each replicate was identified and the same number of fingerlings were retained, at random, in the two other hapas. Finally, at the conclusion of nursing in hapas fish were tagged with Passive Integrated Transponders (PIT) tags and weighed. Only healthy and non-deformed fish were tagged and, again, the hapa within each replicate with the minimum number of suitable fish was identified to determine the number of fish to be tagged from each hapa. The only deformity of note in fish at the time of tagging was a shortened or absent operculum, which was almost exclusively found in the commercial strain.

## Farms

At between 304 and 316 days of age, tagged fish were transported to semi-commercial farms in two carp-growing regions of Bangladesh – Jashore district and Natore–Rajshahi districts. Ten private farms in Jashore (Farms A to J) and nine private farms in Natore–Rajshahi (Farms K to S) were identified and considered representative of 'semi-commercial' farms (Supplementary Material 2) in their respective regions (Table 1).

One pond at each farm was stocked with 82 randomly-selected rohu from each strain. No other rohu were stocked in the 19 ponds. Post-stocking mortalities were noted in Pond C in Jashore district, requiring the replacement of 142 fish ten days later, at the time of stocking ponds in Natore–Rajshahi. These mortalities were attributed to the unanticipated long transport time to this pond and associated stress placed on fish. No mortalities attributed to transport or stocking were recorded in the other 18 ponds.

Limited availability of tagged fish meant that stocking densities of rohu varied across farms, depending on pond size (Table 1). Once stocked, fish were managed according to each farmer's normal practices. Water quality parameters, pond inputs (Table 1 and Supplementary Material 3) and fish weights were monitored over the period of the experiment.

## Measurement

Rohu growth was monitored on farms by netting and weighing random fish. Fish were sampled on a monthly basis, although sampling was not possible every month in every farm due government-imposed constraints on the movement of people due to COVID-19 outbreaks. All sampling and measurement activities were overseen by WorldFish staff. A sample size of ten fish per strain per farm was targeted for each measurement event, although this target was not met in all

TABLE 1A Ponds in the Jashore region.

Farm	Pond area (m <sup>2</sup> )	Mean water depth (Standard deviation; cm)	N all species at stocking	Species stocked*	Grow out period (days)	N all species netted at harvest	N rohu netted at harvest	Feeding regime
A	1214	137.2 (26.4)	30716	black, catla, comm, mrigal, rohu, sting	392	12385	102	Mustard oil cake, wheat bran and commercial feed at 1% of body weight, applied once a day; fish were fed 2 days a week generally
B	850	81.3 (17.6)	711	black, catla, comm, mrigal, rohu	372	403	240	Commercial feed and mustard oil cake at 0.2-1% of body weight, applied once a day; fish were fed 3 days a week generally
C	1214	137.2 (15.2)	1291	big, catla, comm, mrigal, rohu, tilapia	393	978	134	Mustard oil cake and commercial feed at 0.5-2% of body weight, spread over two times a day; fish were fed 2 days a week generally
D	1052	121.9 (15.2)	3066	catla, comm, feather, mrigal, pangas, rohu, silver, walk	374	1742	207	Mustard oil cake, wheat bran and commercial feed at 0.2-1% of body weight, applied once a day; fish were fed 3 days a week generally
E	1133	111.8 (17.6)	25376	catla, rohu, silver, sting	392	7092	120	Mustard oil cake and wheat bran at 0.2-2% of body weight, spread over two times a day; fish were fed 3 days a week generally
F	890	116.8 (8.8)	1090	barb, black, catla, comm, grass, mrigal, rohu, silver	375	673	117	Commercial feed at 0.5-1% of body weight, applied once a day; fish were fed 3 days a week generally
G	1457	116.8 (23.3)	856	catla, comm, grass, mrigal, rohu, silver	373	519	200	Mustard oil cake, maize bran, wheat bran and commercial feed at 1-4% of body weight; fish were fed once in 10 days
H	1376	116.8 (8.8)	1196	barb, bata, catla, comm, mrigal, rohu	382	769	236	Commercial feed at 0.2-1% of body weight, applied once a day; fish were fed 5 days a week generally
I	1052	132.1 (8.8)	25746	catla, rohu, silver, sting	386	4840	129	Commercial feed and mustard oil cake at 0.1-0.5% of body weight, applied once a day; fish were fed 2 days a week generally
J	1214	127.0 (8.8)	43860	black, catla, grass, pabda, rohu, silver, sting	394	30597	209	Commercial feed at 0.1-1% of body weight, spread over 2-3 times a day; fish were fed 6 days a week generally

\*barb, *Barbonymus gonionotus*; bata, *Labeo bata*; big, *Hypophthalmichthys nobilis*; black, *Mylopharyngodon piceus*; catla, *Catla catla*; comm, *Cyprinus carpio*; feather, *Chitala chitala*; grass, *Ctenopharyngodon idella*; mrigal, *Cirrhinus cirrhosus*; pabda, *Ompok bimaculatus*; rohu, *Labeo rohita*; silver, *Hypophthalmichthys molitrix*; sting, *Heteropneustes fossilis*; tilapia, *Oreochromis niloticus*; and walk, *Clarias batrachus*.

TABLE 1B Ponds in the Natore–Rajshahi region.

Farm	Pond area (m <sup>2</sup> )	Mean water depth (Standard deviation; cm)	N all species at stocking	Species stocked*	Grow out period (days)	N all species netted at harvest	N rohu netted at harvest	Feeding regime
K	1376	66.5 (7.0)	558	big, catla, grass, mirror, mrigal, rohu, silver	372	459	185	Farm-made feed at 1-2% of body weight, applied once a day; fish were fed 3 days a week generally
L	890	69.8 (7.8)	321	big, catla, grass, rohu, mrigal	370	291	221	Farm-made feed at 1-2% of body weight, applied once a day; fish were fed 4 days a week generally
M	1416	84.5 (4.2)	726	black, catla, mirror, mrigal, rohu, silver	387	643	211	Farm-made and commercial feed at 0.5-2% of body weight, applied once a day; fish were fed 4 days a week generally
N	1335	74.3 (7.0)	610	catla, grass, mirror, mrigal, rohu, silver	378	534	219	Farm-made feed at 1-2% of body weight, applied once a day; fish were fed 4 days a week generally

(Continued)

TABLE 1B Continued

Farm	Pond area (m <sup>2</sup> )	Mean water depth (Standard deviation; cm)	N all species at stocking	Species stocked*	Grow out period (days)	N all species netted at harvest	N rohu netted at harvest	Feeding regime
O	1295	67.0 (15.9)	749	big, catla, rohu, silver, tilapia	341	664	232	Commercial feed at 1-3% of body weight spread over two times a day; fish were fed 4 days a week generally
P	850	66.0 (8.5)	862	catla, grass, mirror, mrigal, mystus, rohu, silver	308	436	234	Commercial feed at 1-3% of body weight spread over two times a day; fish were fed 6 days a week generally
Q	1376	74 (9.6)	2014	bata, big, catla, grass, mirror, mrigal, rohu, silver	381	1833	197	Commercial feed at 0.5-2% of body weight spread over two times a day; fish were fed 5 days a week generally
R	1052	80.5 (1.0)	764	catla, grass, mirror, mrigal, rohu, silver	383	655	221	Farm-made feed at 1-4% of body weight, applied once a day; fish were fed 6 days a week generally
S	931	72.5 (2.9)	1063	big, black, catla, grass, mirror, mrigal, rohu, silver	379	968	229	Farm-made feed at 1-3% of body weight spread over two times a day; fish were fed 6 days a week generally

\*bata, *Labeo bata*; big, *Hypophthalmichthys nobilis*; black, *Mylopharyngodon piceus*; catla, *Catla catla*; feather, *Chitala chitala*; grass, *Ctenopharyngodon idella*; mirror, *Cyprinus carpio var. specularis*; mrigal, *Cirrhinus cirrhosus*; mystus, *Mystus cavasius*; rohu, *Labeo rohita*; silver, *Hypophthalmichthys molitrix*; and tilapia, *Oreochromis niloticus*.

cases. Ultimately, all rohu were harvested from farms between 623 and 703 days of age (Table 1). At the time of harvest, ponds were partially drained and repeatedly netted in an effort to recover all rohu. Farms O and P were harvested earlier than scheduled due to low pond water levels and the desire of farmers to harvest the trial fish given limited additional pond and water availability. At harvest, all netted and identifiable fish (i.e. with their tag retained) were assessed for body weight (i.e. whole weight; Holden and Raitt, 1974).

## Analyses

Data for fish from nursing replicates two and four (6 and 87 fish, respectively) were excluded from analyses, due to hapa failure resulting in the escape of large numbers of fish from one of the three hapas in each of these replicates (Supplementary Material 1). Data for 525 fish from nursing replicate one was also excluded due to the inadvertent retention of excess fish in one hapa post transfer to 5 mm hapas. Remaining data were log transformed to minimize heteroscedasticity in residuals (Figure 1). Log transformation was also in keeping with multiplicative differences in growth rate between strains (i.e. expressed as a ratio or percentage difference) – log transformation changes a multiplicative effect to an additive effect (Keene, 1995).

Each strain was comprised of a large number of individuals from a relatively small number of families. However, families were pooled soon after spawning and no attempt to track or reconstruct pedigrees was made. Accordingly, to simply analyses

and avoid the risk of underestimating error variances due to unknown genetic relationships between individuals within strains (Ponzoni et al., 2012), analyses were conducted on log10-transformed ‘adjusted mean harvest weights’ at each level of strain-by-farm (Figure 2). Adjusted mean harvest weights were computed by fitting the following model:

$$Y_{ijkl} = \mu + \delta(\bar{X}_{ijkl} - \bar{X}_{...}) + (\alpha\beta)_{ijk} + \epsilon_{ijkl} \quad (\text{Model 1})$$

where  $\mu$  is the grand mean,  $\delta$  is a regression coefficient,  $\bar{X}_{ijkl}$  is the log10-transformed nursing replicate mean tagging weight for individual  $l$  (Supplementary Material 4),  $\bar{X}_{...}$  is the log10-transformed arithmetic mean weight at tagging for all individuals,  $(\alpha\beta)_{ijk}$  is the fixed effect of the ‘interaction’ between ‘strain’  $i$  ( $i$  = ‘G3-multiplier’, ‘control’ or ‘commercial’) and ‘farm’  $k$  ( $k$  = one of A to J, where ‘region’  $j$  = ‘Jashore’, and  $k$  = one of K to S where ‘region’  $j$  = ‘Natore–Rajshahi’),  $\epsilon_{ijkl}$  is the residual and  $Y_{ijkl}$  is the log10-transformed weight at harvest. The ‘covariate’,  $\delta(\bar{X}_{ijkl} - \bar{X}_{...})$ , was included in the model as a nuisance variable in an effort to adjust for enduring nursing replicate effects on harvest-age weight (Supplementary Material 5).

Analyses of adjusted mean harvest weights (Figure 2) were then conducted. Firstly, to test the significance of strain, region and strain-by-region interaction effects:

$$\bar{Y}_{ijk} = \mu + \alpha_i + \gamma_j + (\alpha\gamma)_{ij} + \epsilon_{ijk} \quad (\text{Model 2})$$

where  $\mu$  is the grand mean,  $\alpha_i$  is the fixed effect of ‘strain’  $i$ ,  $\gamma_j$  is the fixed effect of ‘region’  $j$  ( $j$  = ‘Jashore’ or ‘Natore–Rajshahi’),  $(\alpha\gamma)_{ij}$  is the fixed effect of the ‘interaction’ between strain and



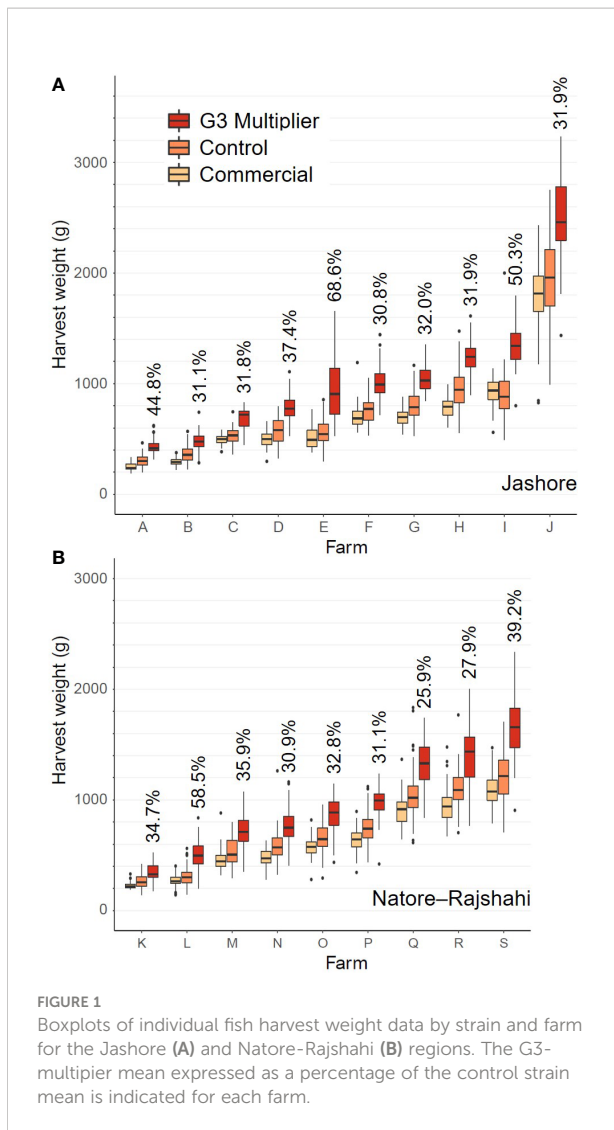


FIGURE 1 Boxplots of individual fish harvest weight data by strain and farm for the Jashore (A) and Natore-Rajshahi (B) regions. The G3-multiplier mean expressed as a percentage of the control strain mean is indicated for each farm.

region,  $\epsilon_{ijk}$  is the residual,  $\bar{Y}_{ijk}$  is the log10-transformed adjusted mean harvest weight.

Secondly, to test the significance of the strain effect separately within each ‘region’  $j$  ( $j = \text{‘Jashore’}$  or ‘Natore-Rajshahi’):

$$\bar{Y}_{ijk} = \mu + \alpha_i + \beta_{jk} + \epsilon_{ijk} \quad (\text{Model 3})$$

where  $\beta_{jk}$  is the fixed effect of ‘farm’  $k$  (within ‘region’  $j$ ) and all other terms are as previously described. Model 3 analyses considered each farm to be an individual replicate of the strain treatments (Ponzoni et al., 2012), which considerably increased the statistical power of tests of the strain effect (Dixon, 2016).

In addition, growth trends between regions were compared by fitting Model 2 and Model 3 for weight at each sampling event over the grow-out period. In all cases, models were fitted using the *lm* function in R (R Core Team, 2020); ii) type III sums of squares were computed using the Anova function of the car

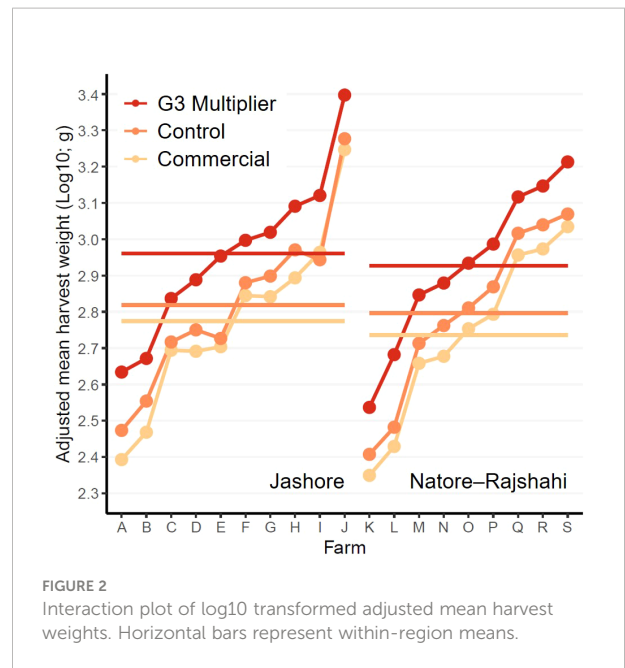


FIGURE 2 Interaction plot of log10 transformed adjusted mean harvest weights. Horizontal bars represent within-region means.

package (Fox and Weisberg, 2019); iii) the significance of all effects were tested according to F-tests, with the mean sum of squares corresponding with the residual term taken as the error to compute the F value (Sahai and Ageel, 2012); iv) means (and standard errors) were computed using the *emmeans* function (Kassambara, 2021); and v) strain pairwise contrasts were conducted using the *emmeans\_test* function with Bonferroni correction (Kassambara, 2021).

## Results

Across strains (i.e. using Model 2), the strain-by-region interaction effect ( $F_{2,51} = 0.0058$ ,  $P = 0.994$ ) and region effect ( $F_{1,51} = 0.2617$ ,  $P = 0.611$ ) were not significant at harvest. In contrast, the overall strain effect across regions was significant ( $F_{2,51} = 3.3329$ ,  $P = 0.044$ ), despite the limited number of farms studied and substantial inter-farm variation in growth (Table 2; Figures 1, 2).

Within regions (i.e. using Model 3), the strain effect was significant in both the Jashore ( $F_{2,18} = 147.9$ ,  $P < 0.001$ ) and Natore-Rajshahi regions ( $F_{2,16} = 292.1$ ,  $P < 0.001$ ) at harvest (Table 3). Furthermore, contrasts between strains revealed statistically significant differences between all three pairwise combinations of strain ( $P \leq 0.003$ ). The G3-multiplier was the most rapidly growing strain at all farms (Figures 1, 2) with a mean harvest weight of 914 g in Jashore and 845 g in Natore-Rajshahi regions (Table 4) – equating to a realised genetic gain of 38.6% and 34.9%, respectively, for the G3-multiplier over the control strain.

TABLE 2 Analysis of variance for Log10 transformed adjusted mean harvest weight across regions (i.e. Model 2).

Source	SS	DF	MSS
Strain	0.3590	2	0.1795
Region	0.0141	1	0.0141
Strain-by-region	0.0006	2	0.0003
Residuals	2.7468	51	0.0539

SS, Sum of squares; DF, degrees of freedom; MSS, Mean Sum of squares.

TABLE 3 Analysis of variance for Log10 transformed adjusted mean harvest weight within regions (i.e. Model 3).

Source	Jashore			Natore–Rajshahi		
	SS	DF	MSS	SS	DF	MSS
Strain	0.1899	2	0.095	0.1707	2	0.0854
Farm	1.4484	9	0.1609	1.2821	8	0.1603
Residuals (Strain-by-farm)	0.0116	18	0.0006	0.0047	16	0.0003

SS, Sum of squares; DF, degrees of freedom; MSS, Mean Sum of squares.

In the Jashore region, fish grew consistently over the trial period (Figure 3A). In contrast, fish growth was initially rapid in the Natore–Rajshahi region but slowed from the onset of winter in late 2021 (Figure 3B). However, neither the strain-by-region interaction effect ( $P \geq 0.459$ ) nor the main region effect ( $P \geq 0.191$ ) was significant within any one measurement event.

## Discussion

The superior growth performance of the G3-multiplier strain was substantial, and similar in magnitude, across both regions under study (38.6% and 34.9% greater than the control strain at harvest, in the Jashore and Natore–Rajshahi regions respectively). These observations were in keeping with i) expectations at the commencement of the WFRGIP – a 10% improvement over the base population was anticipated with each generation of selection (Keus et al., 2017) – ii) results observed in other finfish genetic improvement programs (reviewed by Gjedrem and Rye, 2018); iii) genetic trends

observed in common-garden trials of G1 and G2 rohu families conducted at the WFCGIP facility (Hamilton et al., 2022); and iv) a lack of substantive strain-by-region interaction – a form of genotype-by-environment interaction (Li et al., 2017). Indeed, there was no evidence of a statistically-significant strain-by-region interaction effect in harvest weight ( $P = 0.994$ ; Table 1; Figure 2), suggesting that the substantial realised genetic gains observed in the current study are likely to be expressed in other regions with similar environments and management practices. However – given that only two regions and 19 farms, exhibiting highly variable growth rates, were studied – the possibility of Type II error in the current study, and the detection of statistically significant strain-by-region interaction effects in future studies, cannot be excluded.

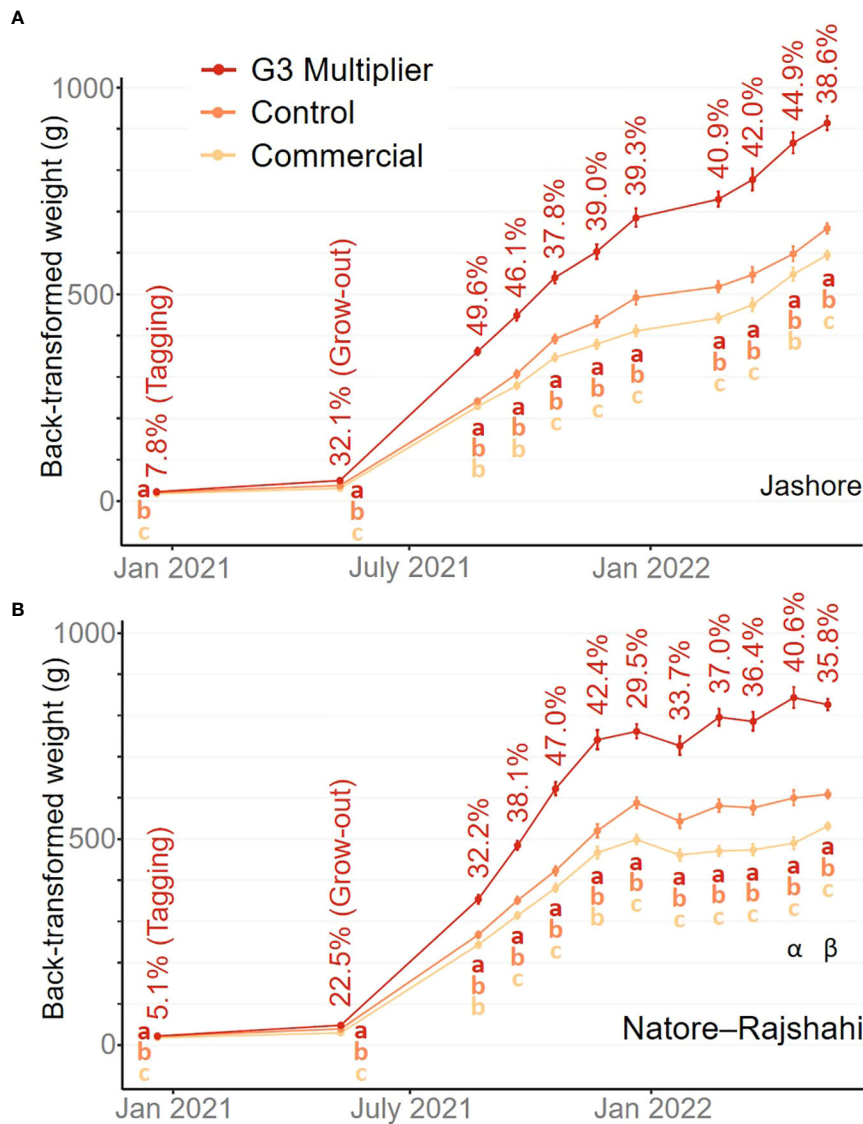
The relatively slow growth rate of the commercial strain was unexpected. This slow growth was conceivably related to the prevalence of deformed opercula in these fish. Opercular deformities can affect the respiratory and feeding apparatus of rohu, potentially adversely impacting on growth (Blaker and Ellis, 2022). Although every effort was made to exclude fish exhibiting such deformities from our study at the time of tagging (Supplementary Material 1) it is possible that fish with minor opercular or related deformities were inadvertently retained. A wide range of non-genetic causal and risk factors have been proposed for operculum deformities (reviewed in Blaker and Ellis, 2022). Furthermore, the provider of the commercial strain indicated that opercular deformities are not routinely observed by their customers, suggesting that these deformities may have resulted from the unconventional transport and nursing environment experienced by these fish in the first 11 days of life, rather than underlying genetic factors. Fish in the commercial strain were spawned, transported (5 day of age), housed in a pond separate to other strains, and then placed in their final nursing hapa positions (11 days of age).

For the purpose of estimating realised genetic gains, the control strain included in the current study was considered genetically equivalent to the base population of the WFRGIP (i.e. unimproved – spawned from fish of river origin) (Hamilton et al., 2019b; Hamilton et al., 2022). However, maintaining control lines representative of an unimproved population, and sampling families from control lines for inclusion in performance trials, presents a number of difficulties (Gjedrem and Baranski, 2009). Indeed, the six families comprising the

TABLE 4 Back-transformed estimated marginal means and 95% confidence intervals (CI).

Source	Jashore			Natore–Rajshahi		
	Mean	Lower CI	Upper CI	Mean	Lower CI	Upper CI
Commercial	594 <sup>a</sup>	572	618	545 <sup>a</sup>	530	560
Control	659 <sup>b</sup>	634	685	626 <sup>b</sup>	609	644
G3 Multiplier	914 <sup>c</sup>	879	950	845 <sup>c</sup>	822	869

Letters indicate significance groups ( $P < 0.05$ ) after Bonferroni adjustment.



**FIGURE 3** Back-transformed estimated marginal means for weight across farms by sampling event within the Jashore (A) and Natore-Rajshahi (B) regions. The G3-multiplier mean expressed as a percentage of the control treatment mean is indicated for each sampling event. Error bars indicate 95% confidence intervals noting that the pond effect was fitted as fixed (Dixon, 2016). Letters indicate significance groups ( $P < 0.05$ ) after Bonferroni adjustment. Note Pond P was not represented in the second last Natore-Rajshahi measurement ( $\alpha$ ) and pond O was not represented in the final Natore-Rajshahi measurement ( $\beta$ ), as these ponds were harvested at an earlier date.

control strain in the current study had a mean total additive genetic worth for harvest-age weight marginally greater than zero (estimated using the method detailed in Hamilton et al., 2022), potentially resulting in corresponding underestimates of genetic gain in the current study. In contrast, the possibility of overestimation of genetic gain due to intraspecific and interspecific competition within ponds (i.e. repression of growth of small rohu by large rohu and other species) cannot be discounted (Ibrahim et al., 2013), particularly given the larger size of the G3-multiplier animals at the time of grow-out-pond

stocking (Figure 2). However, the larger size of G3-multiplier fish at the time of stocking did not fully explain the superior performance of the G3-multiplier strain. When analyses were repeated excluding the lightest 50% of control- and commercial-strain fish at tagging and the heaviest 50% of G3-multiplier fish at tagging, within each nursing replicate (i.e. hapa), the G3-multiplier was 27.4% and 28.9% lighter than the control treatment the time of tagging in Jashore and Natore-Rajshahi, respectively, but 16.0% heavier at harvest in both regions (Supplementary Material 6).



Although the objective of the current study was to treat all fish as they would be in ‘real-world’ polyculture systems, a constraint was placed on the final harvest date – primarily to ensure the results of this study were available to hatcheries, nursery operators and farmers at the time G3-multiplier broodstock were first spawned (i.e. mid 2022). If this constraint had not been imposed, some farmers would have grown their rohu for longer to achieve higher individual weights prior to sale, particularly in the Natore–Rajshahi region (Figure 2). However, given the consistently high estimates of realised genetic gain from the first monthly assessment (August 2021) to harvest (Mar–June 2022) in both regions (Figure 2), it is probable that comparable genetic gains would have been achieved if harvest had been delayed – the lowest estimate of genetic gain in Jashore was 37.8% in Oct 2021 and the lowest in Natore–Rajshahi was 29.5% in Dec 2021.

The clear growth advantages exhibited by the G3-multiplier strain over the control and commercial strains in this study should encourage more Bangladeshi hatcheries, nurseries and farmers to adopt genetically improved rohu. However, beyond enhancing productivity, the medium- to long-term implications of the widespread adoption of more rapidly-growing rohu by Bangladeshi farmers are difficult to predict. For example, it has the potential to alter optimal species ratios, harvest age and size, and management intensity adopted in polyculture systems, as well as the supply and price of rohu in the market – with corresponding economic implications for producers and consumers. The future availability of genetically improved strains of additional carp species (e.g. catla and silver carp; Hamilton et al., 2019a; Hamilton et al., 2021) will inevitably add further complexity to these management and economic considerations.

## Conclusion

The G3-multiplier strain exhibited a mean realised genetic gain of 38.6% and 34.9% for harvest weight over the control treatment in the Bangladeshi regions of Jashore and Natore–Rajshahi respectively, and exhibited the most rapid growth rate across all 19 studied farms. In contrast, the commercial strain exhibited the slowest growth rate in all but one farm. These findings should encourage more Bangladeshi hatcheries, nurseries and farmers to adopt genetically improved rohu and, more generally, provide confidence in the approach to genetic improvement adopted in the WFRGIP and comparable family-based programs.

## Data availability statement

The datasets analysed for this study can be found in the Harvard Dataverse (<https://doi.org/10.7910/DVN/YWEBPK>).

## Ethics statement

The animal study was reviewed and approved by National University of Malaysia (Universiti Kebangsaan Malaysia) Animal Ethics Committee. Written informed consent was obtained from the owners for the participation of their animals in this study.

## Author contributions

Details of author contributions using CRediT (Contribution Roles Taxonomy) follow. MH: Conceptualization, data curation, formal analysis, funding acquisition, methodology, project administration, visualization, writing – original draft preparation. MY: Conceptualization, data curation, funding acquisition, investigation, methodology, project administration, writing – review & editing. MBA: Data curation, investigation, methodology, project administration. MRA: Data curation, investigation. MF: Data curation and investigation. MI: Conceptualization and methodology. BB: Conceptualization and methodology. KS: Conceptualization and methodology. CS: Conceptualization, funding acquisition and methodology. CR: Conceptualization, funding acquisition and methodology. JB: Conceptualization, funding acquisition, methodology, supervision, and writing – review & editing. All authors contributed to the article and approved the submitted version.

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## References

- Belton, B., and Azad, A. (2012). The characteristics and status of pond aquaculture in Bangladesh. *Aquaculture* 358–359, 196–204. doi: 10.1016/j.aquaculture.2012.07.002
- Blaker, E., and Ellis, T. (2022). Assessment, causes and consequences of short opercula in laboratory reared Atlantic salmon (*Salmo salar*). *Anim. Welf.* 31, 79–89. doi: 10.7120/09627286.31.1.007
- Dixon, P. (2016). “Should blocks be fixed or random?,” in *Conference on Applied Statistics in Agriculture (Kansas State University, Manhattan, Kansas: New Prairie Press)*. doi: 10.4148/2475-7772.1474
- DoF (2020). “Yearbook of Fisheries Statistics of Bangladesh, 2019–20?,” in *Fisheries Resources Survey System (FRSS), Department of Fisheries. Bangladesh: Ministry of Fisheries and Livestock, 2020* 37, 141p.
- FAO (2020). *The state of world fisheries and aquaculture 2020. sustainability in action* (Rome, Italy: FAO). doi: 10.4060/ca9229en
- Fox, J., and Weisberg, S. (2019). *An r companion to applied regression. 3rd ed.* (CA: Sage, Thousand Oaks).
- Gjedrem, T., and Baranski, M. (2009). *Selective breeding in aquaculture: an introduction* (New York: Springer).
- Gjedrem, T., and Rye, M. (2018). Selection response in fish and shellfish: a review. *Rev. Aquac.* 10, 168–179. doi: 10.1111/raq.12154
- Hamilton, M. G., Mekkawy, W., Alam, M. B., Barman, B. K., Karim, M., and Benzie, J. A. H. (2023). Genotype-by-culture-system interaction in catla and silver carp: Monoculture and biculture. *Aquaculture* 562, 738846. doi: 10.1016/j.aquaculture.2022.738846
- Hamilton, M. G., Mekkawy, W., Alam, M. B., and Benzie, J. A. H. (2022). Early selection to enhance genetic gain in a rohu (*Labeo rohita*) genetic improvement program. *Aquaculture* 553, 738058. doi: 10.1016/j.aquaculture.2022.738058
- Hamilton, M. G., Mekkawy, W., Barman, B. K., Alam, M. B., Karim, M., and Benzie, J. A. H. (2021). Genetic relationships among founders of a silver carp (*Hypophthalmichthys molitrix*) genetic improvement program in Bangladesh. *Aquaculture* 540, 736715. doi: 10.1016/j.aquaculture.2021.736715
- Hamilton, M. G., Mekkawy, W., and Benzie, J. A. H. (2019a). Sibship assignment to the founders of a Bangladeshi *Catla catla* breeding population. *Genet. Sel. Evol.* 51, 17. doi: 10.1186/s12711-019-0454-x
- Hamilton, M. G., Mekkawy, W., Kilian, A., and Benzie, J. A. H. (2019b). Single nucleotide polymorphisms (SNPs) reveal sibship among founders of a Bangladeshi rohu (*Labeo rohita*) breeding population. *Front. Genet.* 10. doi: 10.3389/fgene.2019.00597
- Holden, M. J., and Raitt, D. F. S. (1974). *Manual of fisheries science. part 2-methods of resource investigation and their application* (Rome: Food and Agriculture Organisation of the United Nations (FAO)).
- Ibrahim, N. A., Zaid, M. Y. A., Khaw, H. L., El-Naggar, G. O., and Ponzone, R. W. (2013). Relative performance of two Nile tilapia (*Oreochromis niloticus* Linnaeus) strains in Egypt: The abbassa selection line and the kafr El sheikh commercial strain. *Aquac. Res.* 44, 508–517. doi: 10.1111/j.1365-2109.2012.03240.x
- Jhingran, V. G., and Pullin, R. S. V. (1985). “A hatchery manual for the common Chinese and Indian major carps,” in *ICLARM studies and reviews, 2nd rev ed* (Manila, Philippines: ICLARM).
- Kassambara, A. (2021). *rstatix: Pipe-Friendly Framework for Basic Statistical Tests (R package version 0.7.0)*. Available at: <https://CRAN.R-project.org/package=rstatix>.
- Keene, O. N. (1995). The log transformation is special. *Stat Med.* 14, 811–819. doi: 10.1002/sim.4780140810
- Keus, E., Subasinghe, R., Aleem, N., Sarwer, R., Islam, M., Hossain, M., et al. (2017). *Aquaculture for income and nutrition: final report* (Penang, Malaysia: WorldFish).
- Khan, M. R. I., Parvez, M. T., Talukder, M. G. S., Hossain, M. A., and Karim, M. S. (2018). Production and economics of carp polyculture in ponds stocked with wild and hatchery produced seeds. *J. Fish.* 6, 541–548. doi: 10.17017/jfish.v6i1.2018.306
- Li, Y., Suontama, M., Burdon, R. D., and Dungey, H. S. (2017). Genotype by environment interactions in forest tree breeding: review of methodology and perspectives on research and application. *Tree Genet. Genomes* 13, 60. doi: 10.1007/s11295-017-1144-x
- Mahapatra, K. D., Saha, J. N., Murmu, K., and Sahoo, P. K. (2016). “Genetic improvement and dissemination of rohu (*Labeo rohita*) in India: impact and lessons learned,” in *Sustainable intensification of aquaculture in the Asia-pacific region. documentation of successful practices*. Eds. W. Miao and K. K. Lal (Bangkok, Thailand: FAO), 28–39.

## Conflict of interest

The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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## Supplementary material

The Supplementary Material for this article can be found online at: <https://www.frontiersin.org/articles/10.3389/faqc.2022.1060335/full#supplementary-material>

- Ponzoni, R. W., James, J. W., Nguyen, N. H., Mekki, W., and Khaw, H. L. (2012). *Strain comparisons in aquaculture species: a manual* (Penang, Malaysia: WorldFish).
- Rahman, M., Varga, I., and Chowdhury, S. (1992). *Manual on polyculture and integrated fish farming in Bangladesh* (Rome: Food and Agriculture Organisation of the United Nations (FAO)).
- Rashid, H. E. (2019). *Geography of Bangladesh. 1st ed.* (New York: Routledge).
- R Core Team (2020). *R: A language and environment for statistical computing* (Vienna, Austria: R Foundation for Statistical Computing).
- Reddy, P. V. G. K., Gjerde, B., Tripathi, S. D., Jana, R. K., Mahapatra, K. D., Gupta, S. D., et al. (2002). Growth and survival of six stocks of rohu (*Labeo rohita*, Hamilton) in mono and polyculture production systems. *Aquaculture* 203, 239–250. doi: 10.1016/S0044-8486(01)00540-3
- Sah, U., Mukhiya, Y., and Wagle, S. K. (2018). Comparative evaluation of genetically improved and farmed rohu (*Labeo rohita*) on growth and yield at initial stage of rearing. *Int. J. Fish. Aquat. Stud.* 6, 47–50.
- Sahai, H., and Ageel, M.I. (2012). *The analysis of variance: fixed, random and mixed models*. Boston: Birkhäuser.
- Vadhel, N., Pathan, J., Shrivastava, V., Akolkar, N., Kumar, S., Misra, C. K., et al. (2020). Comparative study on the performance of genetically improved rohu “Jayanti” and native rohu, *Labeo rohita* fingerlings reared in biofloc system. *Aquaculture* 523, 735201. doi: 10.1016/j.aquaculture.2020.735201
- Wahab, M. A., Kadir, A., Milstein, A., and Kunda, M. (2011). Manipulation of species combination for enhancing fish production in polyculture systems involving major carps and small indigenous fish species. *Aquaculture* 321, 289–297. doi: 10.1016/j.aquaculture.2011.09.020
- Wolak, M. E., and Reid, J. M. (2017). Accounting for genetic differences among unknown parents in microevolutionary studies: how to include genetic groups in quantitative genetic animal models. *J. Anim. Ecol.* 86, 7–20. doi: 10.1111/1365-2656.12597