



## Research report

## Constructing the habituome for phenotype-driven zebrafish research

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## HIGHLIGHTS

- ▶ Habituation is an evolutionarily conserved behavior relevant to exploration.
- ▶ Numerous zebrafish behaviors demonstrate robust habituation in novelty-based tests.
- ▶ The *habituome* is a new conceptual approach to study zebrafish phenotypes.
- ▶ Multiple behaviors habituate independent of anxiolytic and anxiogenic states.
- ▶ Anxiety and habituation sensitivities show no correlation for multiple behaviors.

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## ABSTRACT

Intra-session habituation to novelty reflects spatial working memory (related to exploration and cognition), and is observed in various species, including zebrafish (*Danio rerio*). With the growing understanding of complex zebrafish behaviors, the extent to which they habituate remains unclear. Here we perform a large-scale characterization of zebrafish novelty-evoked (novel tank and open field) behaviors, to establish their grouping based on intra-session habituation and sensitivity to anxiolytic or anxiogenic manipulations. We also assess multiple behaviors in high- and low-anxiety sub-cohorts of a large heterogeneous zebrafish population, comparing their habituation profiles. Overall, our analyses demonstrate that anxiety responsiveness and the ability to habituate show little correlation for multiple zebrafish behaviors, suggesting that they most likely represent distinct behavioral phenomena in novel environments. Using these data, we also present the *habituome* – a new conceptual approach to study affective and cognitive responses in zebrafish by examining a big set of their habituation phenotypes. Given marked similarity in animal novelty exploration, this approach may also be used to construct *habituomes* in other model organisms, including rodents and humans.

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## 1. Introduction

As a form of memory, habituation has long been used in neuroscience research to study cognition and its experimental modulation [1–4]. Representing a reduction in responses to novelty over time [5,6], within-trial (intra-session) habituation is observed in multiple species as an evolutionarily conserved, adaptive behavior relevant to exploration and cognition [1,7–16]. Possessing significant genetic and physiological homology to other vertebrates, zebrafish (*Danio rerio*) are becoming increasingly popular

in neurobehavioral research of affective and cognitive phenotypes [17–22]. Zebrafish display robust anxiety-like behavior in various novelty-based paradigms, including the novel tank [23–25], light-dark box [26], open field (OFT) [27,28] and startle [29,30] tests. These behaviors also habituate well in novelty-based tests, demonstrating high sensitivity to experimental manipulations and confirming the utility of zebrafish models to study both affective and cognitive phenomena [10,24]. Since zebrafish swimming is also characterized by three-dimensional locomotion, they offer the additional value of an ‘extra’ (*vertical*) dimension of locomotion for in-depth behavioral analysis using this species [31–33]. Mounting evidence shows that zebrafish represent an excellent species to study various behavioral syndromes [34,35]. However, as our understanding of the complexity of zebrafish behavior grows [27,32,36,37], the extent to which their multiple behaviors habituate remains unclear. Here, we apply two paradigms – the novel

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tank and open field tests – to examine how zebrafish behavioral phenotypes can be grouped based on habituation and sensitivity to novelty stress.

From a theoretical point of view, the sensitivity to anxiety and the ability to habituate may reflect either inter-related or independent behavioral phenomena [38]. For example, a specific behavior can be highly sensitive to anxiogenic factors, but show low or unaltered habituation (e.g., habituate equally well in both control and experimental groups, or habituate in controls but not in experimental cohorts). Although human [39,40] and rodent [2,41] literature supports a complex interplay between anxiety and habituation, this aspect has not been analyzed in a systematic manner. Capitalizing on robust anxiety and habituation phenotypes in zebrafish, our study examined their behaviors in several anxiety paradigms, while also assessing their ability to habituate. Specifically, we studied whether behaviors that are highly sensitive to anxiety would also be those that habituate to the greatest extent. Developed here as a novel conceptual and methodological approach, the zebrafish *habituome* (a big set of their habituation phenotypes) may become a useful tool to understand complex affective and cognitive responses.

## 2. Methods

### 2.1. Animals, housing and behavioral testing

In Experiment 1, we analyzed raw 6 min novel tank data previously generated for 200 adult (4–7 month-old;  $\approx$ 50:50 male:female ratio) wild type 'short-fin' zebrafish in a previously published study on 3D video-tracking [32]. In Experiment 2, the 30 min novel tank test data were generated for this project using 40 adult (4–7 month-old;  $\approx$ 50:50 male:female ratio) wild type 'short-fin' zebrafish obtained from a local vendor (50 Fathoms, Metairie, LA). Two trial durations were chosen here as commonly used in zebrafish research [23,32,33,42], and also to assess the possibility that zebrafish habituation responses can be more robustly affected during the first minutes (e.g., 6 min) of novelty exposure vs. trials of longer duration (see [24] for details). Animals were housed in groups of 20–30 per 20 L tank, and given at least 10 days to acclimate to the laboratory environment. Tanks were filled with filtered facility water maintained at a temperature of 25–27 °C. Illumination was provided using fluorescent lights on a 12 h cycle (on 6:00 h; off 18:00 h), consistent with the standards of zebrafish care [43]. Fish were fed Tetraamin Tropical Flakes (Tetra USA, Blacksburg, VA) twice daily. The novel tank protocol applied here used a 1.5 L trapezoidal tank (15 cm  $h \times$  7 cm  $w \times$  28 cm top  $\times$  23 cm bottom  $l$ ; Aquatic Habitats, Apopka, FL) maximally filled with aquarium water and divided into two equal halves, demarcated by a virtual horizontal line [32], recorded manually and using video-tracking (see further) for 6 or 30 min (see Table 1, Fig. 1 and [32] for a detailed list of endpoints). All experimenters used in this study were highly trained and showed a high inter- and intra-rater reliability >85%, as assessed by Spearman correlation.

To modulate zebrafish anxiety in Experiment 1, several genetic, psychological and pharmacological manipulations used in the novel tank test [32] included anxiolytic drugs (chronic fluoxetine, 100  $\mu$ g/L  $\times$  2 weeks; chronic ethanol, 0.3%  $\times$  1 week; chronic morphine, 1.5 mg/L  $\times$  2 weeks, and acute nicotine, 10 mg/L  $\times$  5 min) and anxiogenic treatments (acute caffeine, 250 mg/L  $\times$  20 min; chronic morphine exposure, for 3 h  $\times$  2/day  $\times$  1 week; acute alarm pheromone exposure for 5 min, and 'high-anxiety' leopard zebrafish strain [32]). The pharmacological manipulations and doses were chosen based on prior studies with these and other drugs [19,44,45].

The OFT data for Experiment 3 was generated using 80 naïve adult wild-type 'short-fin' zebrafish (4–7 month-old;  $\approx$ 50:50 male:female ratio) obtained from a local vendor (50 Fathoms, Metairie, LA). For this study, we utilized 6 and 30 min trials, exposing parallel cohorts of zebrafish ( $n=20$ ) to 'large' OFT1 (12 cm  $h \times$  39 cm  $w \times$  47 cm  $l$ ) or 'small' OFT2 (14 cm  $h \times$  29 cm  $w \times$  37 cm  $l$ ) with a 12 cm water level. Since the larger rectangular OFT tank was of similar size to that used in the rodent OFT studies [46], a smaller arena was also utilized in our study, to allow the results to be translatable between different model organisms (see Fig. 2 and [28] for a detailed list of endpoints).

Behavioral testing in all experiments was performed between 11:00 and 16:00 h. Each trial was recorded via auto-focusing 2.0 MP USB webcams placed 50 cm in front of the novel tank, and 1 m above the OFT. Automated data analysis was performed on the recorded videos using EthoVision XT7 (Noldus IT, Wageningen, Netherlands) suite, with detection settings selected to acquire 23 novel tank and 23 OFT endpoints, to the best of our knowledge representing the most detailed analyses of zebrafish behavior via currently available IT-based video-tracking tools.

In Experiment 4, focusing on the population validity of our study, we used data from a large cohort of 200 naïve adult (4–7 month-old;  $\approx$ 50:50 male:female ratio) wild type 'short-fin' zebrafish obtained from the local vendor and used as naïve controls in various other ongoing projects of our laboratory. Allowing us to capitalize

on the availability of raw behavioral data from multiple control animals, this should not be perceived as the general requirement to have a large number of animals for habituation studies, since robust habituation was observed in smaller cohorts previously [24]. However, the fact that we maximize the use of raw data from other research to extract new information is consistent with the growing recognition of meta-analysis of raw clinical and biological data as critical for ethical biomedical research [47,48]. All animals used in this study were exposed to a standard 6 min novel tank test, and assessed using EthoVision XT7 software, as in Experiment 1. Using cumulative (6 min) top duration data as a primary measure of zebrafish anxiety [32,42], we grouped zebrafish into high- and low-anxiety sub-cohorts with each representing 10% of the overall 200 fish population, using low and high top duration, respectively. A large-scale evaluation of 23 novel tank behavioral endpoints (Table 2) was then performed, including analyzing their per-minute distribution and habituation (assessed by single-minute habituation ratio SHR, see further), to compare habituation profiles of the two sub-cohorts selected from a large population solely based on their anxiety differences. To eliminate locomotion as a potential confounding factor in this experiment, the average distance traveled was calculated for the entire 200 fish cohort ( $9.5 \pm 5$  m), and fish were finally selected for high- or low-anxiety sub-cohorts of 20 fish, based on their activity levels being similar to the population average, but with robust differences in top duration (used here as the primary anxiety measure; Table 2). All experimental procedures were in full compliance with National and Institutional guidelines on animal experimentation and care.

### 2.2. Statistical analysis

Analyzing anxiety responses in Experiment 1 and using raw data from [32], we compared cumulative 6 min values for each experimental endpoint to its control cohort by non-paired Wilcoxon–Mann–Whitney  $U$ -test ( $P < 0.05$ ). Data were then analyzed for their per-minute distribution, computing the ratio of behaviors during the first: last minute (single-minute habituation ratio, SHR) of a 6 min (Experiment 1) or 30 min (Experiment 2) novel tank trial, as described previously [24], by the paired  $U$ -test ( $P < 0.05$ ). The OFT 6 min/30 min anxiety and habituation data in Experiment 3, and 6 min novel tank test data in Experiment 4, were analyzed in a similar manner.

While this was not the main focus of this study, cluster analysis was first applied to Experiment 1 data to reconfirm subgroups of observed novel tank test behavioral endpoints [32]. To assess their sensitivity to anxiety, behavioral endpoints for each experimental manipulation were normalized (with the sum of min 1–6 values taken as 100%) and expressed as a percent change. Hierarchical clustering was performed across all behavioral endpoints and treatment groups with Hierarchical Clustering Explorer 3.0 (University of Maryland, College Park, MD) using Average Linkage as the linkage method and Euclidian Distance as the similarity metric. The habituation ability and anxiety responses (Table 1) were further evaluated for possible correlation across all experimental manipulations and behavioral endpoints. For this, habituation data were first normalized for min 1–6, and their SHR values expressed as percent change, calculated as  $[(\text{Min } 1 - \text{Min } 6)]$ . Sensitivity to anxiety was calculated by expressing mean non-normalized control value as 100%, the behavior of the experimental animals as % of average control group, and expressed as the percent change  $[(100\% - \text{experimental group}\%)]$ . Finally, Spearman correlation was applied to correlate anxiety and habituation data, and to assess inter- and intra-rater reliability for manual observers. In all experiments reported here,  $P < 0.05$  was set as statistically significant.

## 3. Results

Assessing exploratory behavior of naïve zebrafish in the 6 min and 30 min novel tank tests, we observed an overt increase over time in transitions and time spent in the top of the novel tank, as well as decreased freezing bouts, but not erratic movements (Fig. 1, Experiments 1 and 2), as reported previously [24]. Similar profiles were observed in the 6 min and 30 min OFT trials, with an increase in mobility as the trial progressed (Fig. 2, Experiment 3). In the novel tank test (Experiment 1), anxiogenic manipulations predictably lowered top exploration while increasing freezing activity, while anxiolytic manipulations reduced erratic and freezing behavior but increased top exploration [32]. Correlating experimental manipulations with behavioral endpoints, a hierarchical cluster analysis in our earlier study [32] revealed two distinct groups – 'anxiogenic' Cluster 1 (alarm pheromone, caffeine and the leopard strain) and 'anxiolytic' Cluster 2 (chronic ethanol, morphine, fluoxetine and acute nicotine), which were reconfirmed here (data not shown) based on raw behavioral data from a project unrelated to habituation analyses.

Zebrafish habituation, which was the main focus of this study, was also assessed in relation to the anxiolytic or anxiogenic

**Table 1**  
Correlation of habituation and anxiety sensitivities across experimental manipulations and behavioral endpoints. Behavioral endpoints here are listed based on their clustering in Fig. 3 (only treatments and behaviors demonstrating significant correlation ( $P < 0.05$ ) between single-minute habituation ratio and anxiety are highlighted). The strength of correlation is given as percentage, expressed as  $R \times 100\%$  and classified based on positive (0–50%, italics; 50–100%, italics underlined) and negative (0% to –50%, bold; –50% to –100%, bold underlined) correlation. Other non-significant endpoints (not shown) include highly mobile duration (s), rapid moving frequency, rapid moving duration (s), mobile frequency, and immobile frequency. (Please refer to [72] for detailed descriptions of all behavioral endpoints.)

Behavioral endpoints	Anxiogenic manipulations			Anxiolytic manipulations			
	Alarm pheromone	Acute caffeine	Leopard strain	Chronic ethanol	Chronic fluoxetine	Acute nicotine	Chronic morphine
Highly mobile frequency	–7.6	1.1	15.2	<u>52.2</u>	13.6	<b>–73.1</b>	<b>–51.9</b>
Slow moving duration (s)	<b>–70.1</b>	–29.9	–10.7	27.8	–52.2	–29.3	–26.5
Immobile duration (s)	<b>–74.2</b>	–32.0	–39.3	–29.8	–47.6	<b>–70.7</b>	<b>–53.6</b>
Slow moving frequency	–48.2	–36.5	–3.1	47.1	–44.8	17.4	–9.1
Distance traveled (m)	–0.7	41.5	82.3	10.9	–7.5	75.2	41.1
Mobile duration (s)	57.2	84.4	83.7	17.1	–40.4	84.2	73.2
Vertical turn angle (°)	–50.6	<b>–61.7</b>	38.3	<u>52.3</u>	2.0	7.2	–34.2
Average velocity (m/s)	–19.1	25.6	–54.4	–18.3	5.5	25.3	<b>–67.5</b>
Vertical turn bias (°)	<b>–80.3</b>	–40.0	–52.8	–34.0	–47.4	0	<b>–56.4</b>
Vertical turn rate (°/s)	–50.6	<b>–60.1</b>	38.3	<u>52.3</u>	2.0	0	–34.2
Vertical meandering (°/m)	–41.0	42.9	38.8	51.9	42.9	52.9	<u>77.6</u>
Total vertical meandering (°/m)	–34.5	25.4	36.2	18.5	–27.5	50.0	<u>82.0</u>
Time in top (s)	<u>80.4</u>	–2.0	–3.2	0.8	–48.6	–24.6	–15.8
Transitions to top	<b>–99.5</b>	–41.6	–24.8	3.1	56.5	–50.5	–23.9

manipulations described above. As shown in Fig. 3, the ability of multiple behaviors to habituate was independent of anxiolytic and anxiogenic states, since various indices in Experiment 1 exhibited high sensitivity to anxiety, yet showing a low degree of habituation, and vice versa. For example, despite their considerable sensitivity to anxiety, some inter-related behaviors (e.g., top transitions and duration, or immobility frequency and duration) exhibited opposite alterations within the same (i.e., anxiogenic or anxiolytic) treatment cluster (Fig. 3). Importantly, the obtained habituation-based clustering differed markedly from clustering of zebrafish behaviors based on their sensitivity to anxiety (performed in a separate large-scale study [32]), lending further

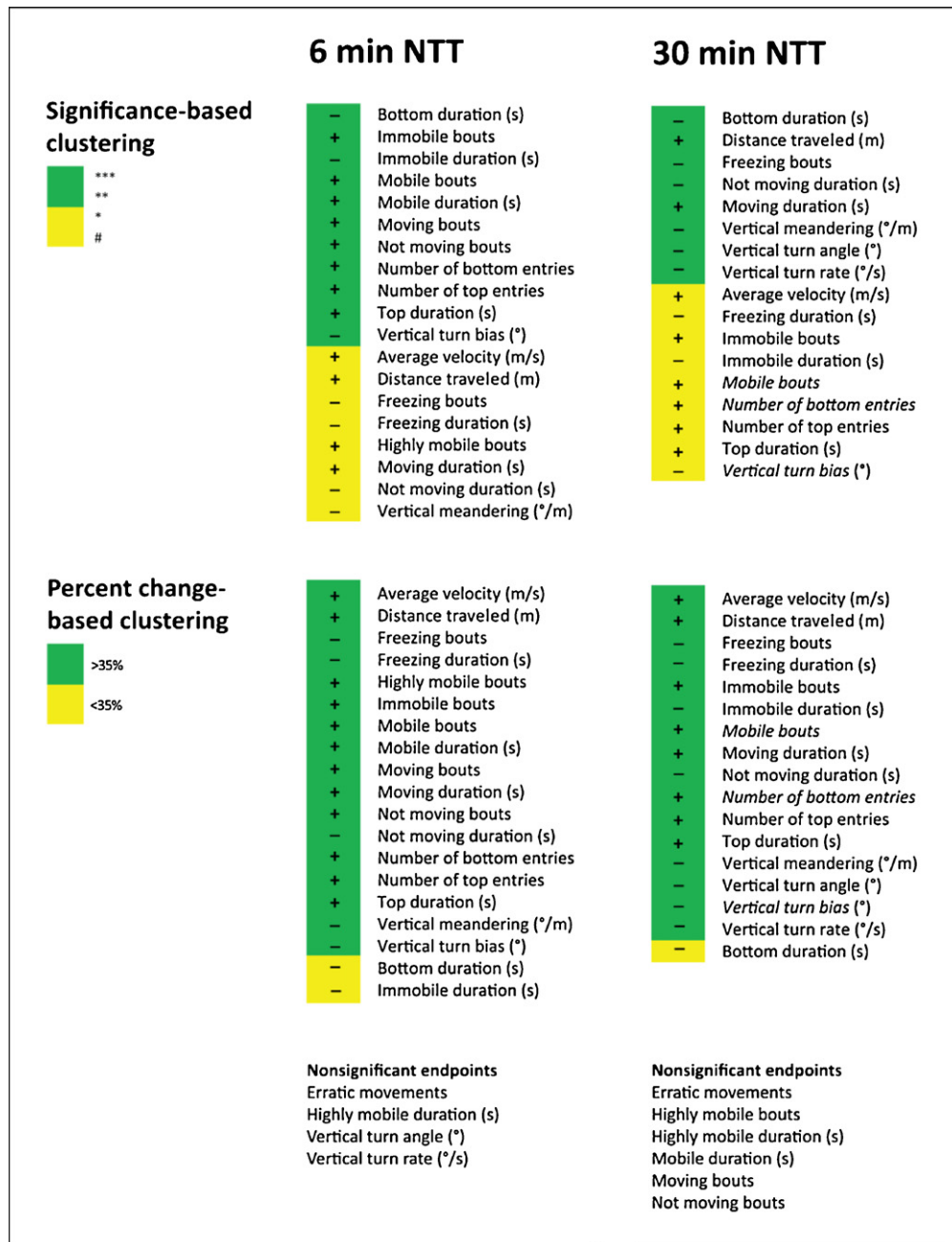
support to the notion that sensitivity to anxiety and the ability to habituate are generally independent for zebrafish phenotypes observed in novelty-based paradigms. The two distinct clusters observed here, while seemingly unrelated, may derive from spatio-temporal influences on zebrafish behavioral patterning. For example, zebrafish scale their locomotor activity depending on the size of the tank and exhibit an inherent behavioral organization in a new environment [28]. In turn, the habituation sensitivity of different behavioral indices may be modulated depending on their role in the spatio-temporal strategies of zebrafish exploration.

Table 1 shows correlation of habituation and anxiety data in the novel tank test performed across all experimental

**Table 2**  
Comparison of anxiety-related behaviors and their habituation in high- and low-anxiety sub-cohorts of zebrafish selected from a large heterogenous population of 200 naïve adult wild-type zebrafish. Zebrafish sub-cohorts were selected based on top:bottom preference (assessed by top duration as the primary anxiety-related measure) and unaltered locomotor activity (mean distance traveled  $\pm 1$  SD from the mean for the large population; see Section 2 for details). Habituation was assessed as % change of single-minute habituation ratio. Sensitivity to anxiety was expressed as the mean of the cumulative min 1–6 data per for behavioral endpoint ( $P < 0.05$ ;  $^{\#}P = 0.05–0.1$ , trend; unpaired  $U$ -test for anxiety or habituation data comparing the respective high- vs. low-anxiety sub-cohorts).

Behavioral endpoints	Low-anxiety sub-cohort ( $n = 20$ each)		High-anxiety sub-cohort ( $n = 20$ each)		$P$ ( $U$ -test)
	Raw data (anxiety sensitivity)	Habituation (%)	Raw data (anxiety sensitivity)	Habituation (%)	
<b>Selection criteria</b>					
Distance traveled (m)	9.7 $\pm$ 0.2	43.5	9.5 $\pm$ 0.3	45.4	NS
Top duration (s)	56 $\pm$ 16 <sup>*</sup>	99.8	1 $\pm$ 0.5 <sup>*</sup>	327.06	<sup>*</sup> <0.015
<b>Associated endpoints</b>					
Bottom duration (s)	303 $\pm$ 16 <sup>*</sup>	–12.6	358 $\pm$ 1 <sup>*</sup>	–1.21	<sup>*</sup> <0.015
Bottom frequency	15 $\pm$ 2 <sup>*</sup>	95.0	6.8 $\pm$ 0.4	4.2 <sup>*</sup>	<sup>*</sup> <0.014
Number of top entries	11 $\pm$ 2 <sup>*</sup>	191.7	0.85 $\pm$ 0.4 <sup>*</sup>	0	<sup>*</sup> <0.014
Vertical meander (°/m $\times 10^6$ )	1.5 $\pm$ 0.5 <sup>#</sup>	–81.2	1.7 $\pm$ 0.7 <sup>#</sup>	–74.2	<sup>#</sup> 0.058
<b>Other endpoints</b>					
Average velocity (m/s)	0.2 $\pm$ 0.0	44.6	0.2 $\pm$ 0.0	45.1	NS
Erratic movements	0.6 $\pm$ 0.2	–80.0	0.8 $\pm$ 0.5	–83.3	NS
Freezing bouts	0.9 $\pm$ 0.3	–81.8	0.8 $\pm$ 0.2	–88.9	NS
Freezing duration (s)	64 $\pm$ 22	–71.5	83 $\pm$ 27	–17.7	NS
Highly mobile duration (s)	0.7 $\pm$ 0.2	–50.3	0.9 $\pm$ 0.2	–64.3	NS
Highly mobile frequency	14 $\pm$ 3	–29.8	18 $\pm$ 3	–37.9	NS
Immobile duration (s)	337 $\pm$ 2	–3.8	335 $\pm$ 2	–1.2	NS
Immobile frequency	265 $\pm$ 24	82.1	294 $\pm$ 26	45.4	NS
Mobile duration (s)	22 $\pm$ 2	50.1	23 $\pm$ 2	16.0	NS
Mobile frequency	260 $\pm$ 27	69.3	297 $\pm$ 27	38.9	NS
Moving duration (s)	212 $\pm$ 9	71.1	198 $\pm$ 9	84.8	NS
Moving frequency	1016 $\pm$ 71	14.8	974 $\pm$ 57	38.8	NS
Not moving duration (s)	152 $\pm$ 8	–50.1	162 $\pm$ 10	–49.6	NS
Not moving frequency	1031 $\pm$ 65	17.3	971 $\pm$ 57	41.7	NS
Vertical turn angle (°)	205 $\pm$ 19	–48.3	218 $\pm$ 17	–48.4	NS
Vertical turn bias (°)	122 $\pm$ 37	–64.0	111 $\pm$ 31	–63.1	NS
Vertical turn rate (°/s)	6152 $\pm$ 583	–48.3	7313 $\pm$ 824	–43.1	NS

NS - nonsignificant ( $U$ -test).



**Fig. 1.** Cluster analysis of endpoints recorded in the 6 min and 30 min novel tank tests (NTT) based on their ability to habituate (min 1 vs. min 6 or min 30) in naive control fish. Data is presented based either on significance (top panel; \* $P < 0.05$ , \*\* $P < 0.01$ , \*\*\* $P < 0.005$ ; # $P = 0.05$ – $0.1$ , trend;  $U$ -test) or percent change (bottom panel; last vs. first min of the test, expressed as absolute value vs. min 1 taken as 100%; high:  $>35\%$ ; low:  $<35\%$ ). Only behaviors demonstrating robust habituation are shown in this diagram, color-coded to denote degree of habituation for each endpoint (endpoints showing trends for their habituation ( $P = 0.05$ – $0.1$ ,  $U$ -test) are denoted by italics). Habituation for significant endpoints is also denoted as either increasing (+) or decreasing (-) over the course of the 6 min or 30 min session.

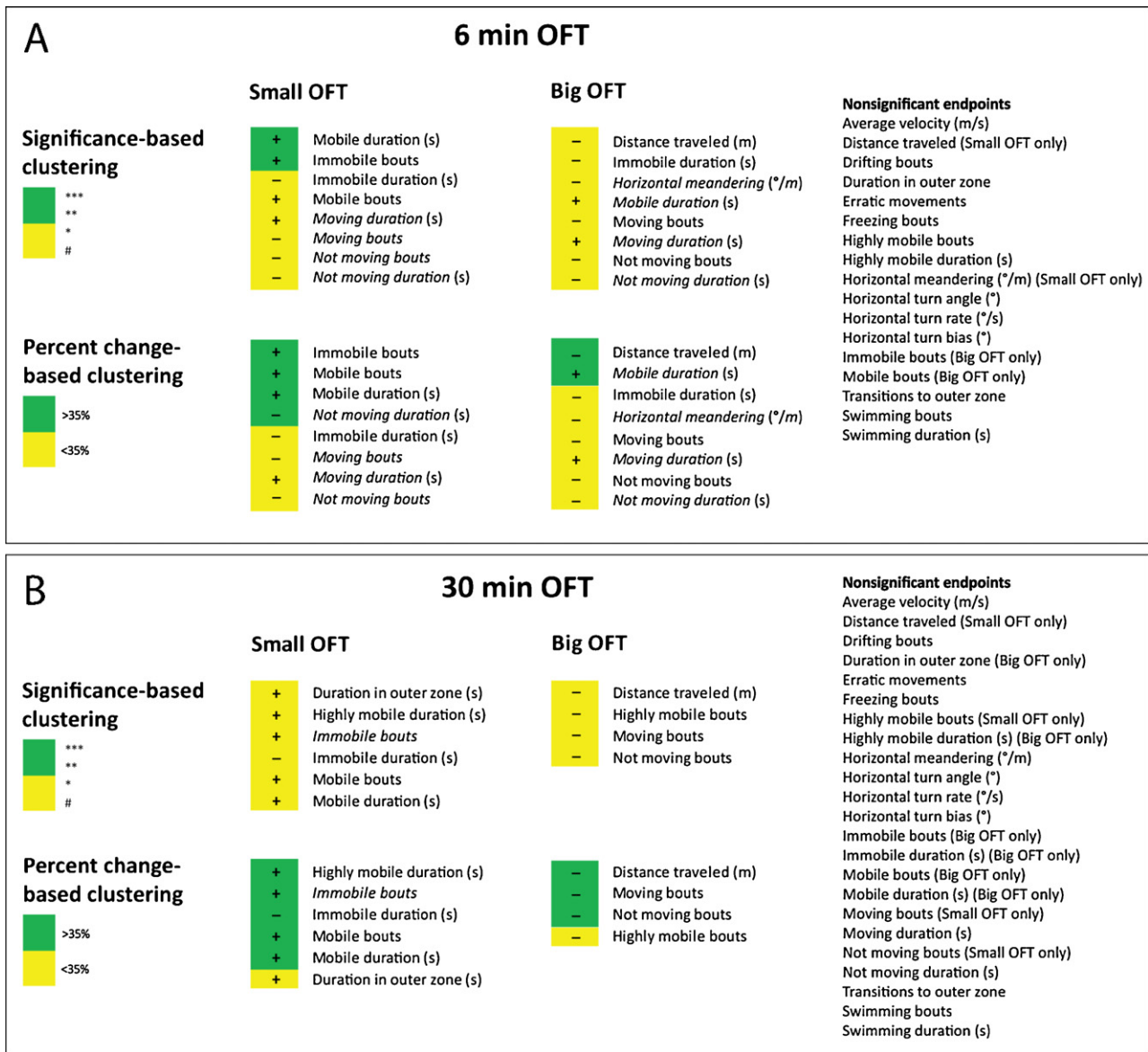
manipulations and behavioral endpoints. Similar to Fig. 3, this analysis further revealed habituation and anxiety responsiveness as independent of anxiolytic and anxiogenic states. This lack of correlation is again highlighted by the variability in the behaviors that are conventionally inter-related. For example, top transitions and duration showed a counter-intuitive relationship relative to one another (with a negative and positive correlation, respectively), and no correlation between SHR and anxiety for most experimental manipulations.

Finally, Experiment 4 provided another important confirmation to the independence of habituation and sensitivity to anxiety for

zebrafish novel tank behaviors. As shown in Table 2, while highly significant differences were predictably detected for main anxiety measures in high- vs. low-anxiety sub-cohorts, these two groups did not show overt differences in the ability to habituate for most of the recorded behavioral endpoints.

#### 4. Discussion

This study is the first large-scale analysis of adult zebrafish habituation using a wide spectrum of manual and computer-generated endpoints in various high- and low-anxiety situations, and in several popular zebrafish behavioral tests. We first



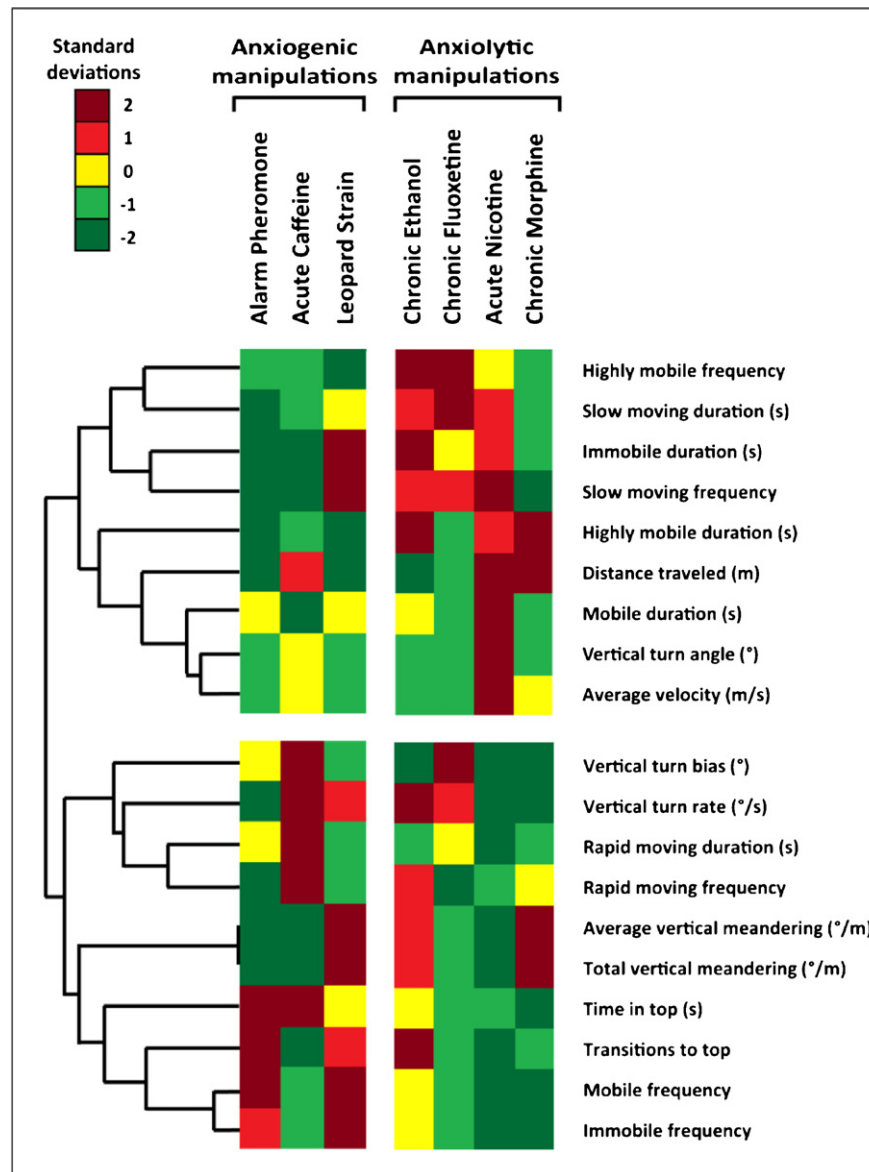
**Fig. 2.** Cluster analysis of endpoints recorded in the 6 min and 30 min open field tests (OFT) based on their ability to habituate (min 1 vs. min 6 or min 30) in naive control fish. Data is presented based on either significance ( $P < 0.05$ ,  $**P < 0.01$ ,  $***P < 0.005$ ; #  $P < 0.05-0.1$ , trend;  $U$ -test) or percent change. Only behaviors demonstrating habituation are shown in this diagram, color-coded to denote degree of habituation for each endpoint. Non-significant endpoints are listed to the right, while 'trends' ( $P = 0.05-0.1$ ) are denoted by italics. Habituation for significant endpoints is also denoted as either increasing (+) or decreasing (-) over the course of the 6 min or 30 min session.

characterized intra-session habituation to novelty, using both short (6 min) and long (30 min) trials to cluster zebrafish behaviors based on their ability to habituate (Figs. 1 and 2). We then overlapped the identified clusters with known grouping of these behaviors based on their sensitivity to anxiety [32], assessing habituation profiles of these behaviors under high- and low-anxiety conditions. Completion of these tasks allowed us to construct the zebrafish *habituome* (Fig. 3), where treatments and behavioral phenotypes were organized based on the degree of their habituation.

Further validating the recently established zebrafish models of habituation [23,24], the *habituome* approach developed here presents an integrative concept for modeling zebrafish phenotypes. It globally assesses multiple behavioral endpoints based on their habituation, and provides several valuable insights into its relation to anxiety by showing how some behaviors may be highly sensitive to anxiety, yet show relatively low habituation. For example, while the distance traveled and average velocity are often

modulated in zebrafish by exposure to stress [17,32], they exhibited no clear-cut habituation over the 6 min novel tank trial (Fig. 3). Therefore, this finding may provide a dissection between anxiety, activity and habituation phenotypes for some zebrafish behaviors, as can be suggested theoretically (see [38] for discussion).

Notably, zebrafish habituation in the novel tank and OFT tests seems to parallel some rodent habituation responses in the OFT paradigms. For example, zebrafish gradually increase mobility without significant alteration in distance traveled throughout the trials, and do not demonstrate the habituation of thigmotaxis (which rodents do in the OFT [27,49–51]) since their time spent near the walls remained relatively constant throughout the trial (Fig. 2). In contrast, the habituation of geotaxis (bottom preference) exhibited in the novel tank strikingly parallels rodent thigmotaxis, with the fish gradually entering the top as the trial progressed (Fig. 1). Such similarity in both anxiety and habituation profiles suggests that zebrafish geotaxis in the novel tank may be a better



**Fig. 3.** The zebrafish *habituome* representing bi-directional cluster analysis of behavioral endpoints according to habituation sensitivity for zebrafish exposed to selected anxiolytic and anxiogenic experimental manipulations in the 6 min novel tank test, with min 1 vs. min 6 habituation data normalized and expressed as % change ratio. Note that habituation-based clustering of these endpoints differs markedly from clustering of the same endpoints based on their sensitivity to anxiety, performed in a separate large-scale study using the same raw data [32]. This finding further supports the notion that sensitivity to anxiety and the ability to habituate are independent phenomena/traits in zebrafish novelty-based paradigms.

measure of zebrafish novelty responses, with higher construct validity and similarity to rodent (than fish) thigmotaxis. Albeit not the main focus of this study, this observation also implies that geotaxis-based models, such as the novel tank test, may represent a more sensitive aquatic behavioral paradigm, compared to thigmotaxis-based anxiety tests like zebrafish OFT. The lower number of OFT behaviors able to habituate, as compared to the novel tank test (Figs. 1 and 2), further supports this notion. Finally, relatively similar habituation profiles between the small and large OFTs further extend the generality of behavioral observations made in this study (Fig. 2).

In addition to predictive, construct and face validity of animal models of brain disorders, the importance of population validity (the ability to reflect natural variance in phenotypes observed in general population) is becoming widely recognized

in translational neuroscience research [52,53]. The covariation of different behaviors has also been suggested as forming the basis for personality differences [54–56]. Therefore, as observed inter-population variance may provide further support for zebrafish ‘emotional’-like behavior, these differences were also assessed here. Specifically addressing this aspect in the present study, Experiment 4 was designed to examine whether sub-populations of subjects selected based on their differing anxiety levels will also display robust differences in habituation. Table 2 shows, however, that despite robust behavioral differences in anxiety-related behaviors observed between high- and low-anxiety groups, this did not result in major differences in the ability of most of zebrafish behaviors to habituate. Therefore, habituation and sensitivity to anxiety in zebrafish novelty paradigms seem to represent distinct behavioral domains, the high-throughput

phenotyping of which may target them differentially, even within a single experimental session. Our *habituome*-based approach may not only allow us to address a wider spectrum of complex neurobiological (e.g., affective and cognitive) phenomena, but can also enhance multi-domain screening for potential therapies, including both anxiolytic and cognitive enhancer agents.

It currently remains unclear how habituation indices cluster according to various other factors, such as pharmacological agents, genetic mutations and environmental enrichment [57,58]. While our approach provided large-scale insight into habituation profiles for selected experimental manipulations (Fig. 3), it may foster further research screening various modulating agents. For example, as habituation is sensitive to genetic differences in rodents [2,59,60] and humans [61–63], the proposed *habituome*-based approach to genetically modified zebrafish can be applied to generate a gene-phenotype map and differentiate their motor, affective and cognitive profiles. This, in turn, may markedly enhance our ability to analyze the complex genetic underpinnings of animal behavior.

This study also highlights the potential differences between manual and automated recording of zebrafish behavior. While the reliability of video-tracking zebrafish behavior has already been established [31–33,44,64], our results further support the higher accuracy and precision of video-tracking tools. For example, fish exposed to alarm pheromone in the present study demonstrated an increasing intra-session habituation for time in and transitions to the top of the novel tank (Fig. 3). While an earlier study using manual observation showed an overt increasing pattern of habituation, it did not reach statistical significance due to the considerable standard error present [24]. Therefore, revealing the sensitivity of habituation analyses to experimenter bias and subjective variation, our data supports the need for continued development of reliable automated neurophenotyping tools to quantify zebrafish behaviors, including their habituation.

Finally, our observation that sensitivity to anxiety in zebrafish does not determine the ability of their behaviors to habituate is important from a theoretical point of view. Most likely representing an adaptive behavioral strategy, this suggests that zebrafish maintain a balance between anxiety behaviors that habituate (e.g., top preference, reflecting exploration) and do not habituate (e.g., erratic movements, providing constant 'vigilance'), both critical for animal survival. With the continued development of new IT-based tools for zebrafish behavioral analyses, greater progress can be made to enhance our understanding of complex trait interconnectivity in this model organism. Given the similarity between habituation in various species [3,4,15,16], it can be expected that similar approaches can be used to construct *habituomes* in other species, including rodents and humans. Thus, in combination with cross-species [65–67] and multi-domain behavioral analyses [68–71], zebrafish *habituome*-based research may serve as an important "bridge" in neurobehavioral phenotyping, revealing novel associations within the systems biology approach.

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## References

- [1] Bolivar VJ. Intrasession and intersession habituation in mice: from inbred strain variability to linkage analysis. *Neurobiology of Learning and Memory* 2009;92(2):206–14.
- [2] Salomons AR, van Luijk JA, Reinders NR, Kirchhoff S, Arndt SS, Ohl F. Identifying emotional adaptation: behavioural habituation to novelty and immediate

- early gene expression in two inbred mouse strains. *Genes, Brain, and Behavior* 2010;9(1):1–10.
- [3] Kandel ER. The molecular biology of memory storage: a dialogue between genes and synapses. *Science* 2001;294(5544):1030–8.
- [4] Rankin CH, Abrams T, Barry RJ, Bhatnagar S, Clayton DF, Colombo J. Habituation revisited: an updated and revised description of the behavioral characteristics of habituation. *Neurobiology of Learning and Memory* 2009;92(2):135–8.
- [5] Leussis MP, Bolivar VJ. Habituation in rodents: a review of behavior, neurobiology, and genetics. *Neuroscience and Biobehavioral Reviews* 2006;30(7):1045–64.
- [6] Thompson RF, Spencer WA. Habituation: a model phenomenon for the study of neuronal substrates of behavior. *Psychological Review* 1966;73(1):16–43.
- [7] Angelucci ME, Vital MA, Cesario C, Zadusky CR, Rosalen PL, Da Cunha C. The effect of caffeine in animal models of learning and memory. *European Journal of Pharmacology* 1999;373(2–3):135–40.
- [8] Maroun M, Akirav I. Arousal and stress effects on consolidation and reconsolidation of recognition memory. *Neuropsychopharmacology* 2008;33(2):394–405.
- [9] Mello PB, Benetti F, Cammarota M, Izquierdo I. Effects of acute and chronic physical exercise and stress on different types of memory in rats. *Anais da Academia Brasileira de Ciências* 2008;80(2):301–9.
- [10] Raymond J, Chanin S, Stewart AM, Kyzar E, Gaikwad S, Roth A. Assessing habituation phenotypes in adult zebrafish: intra- and inter-trial habituation to novelty. In: Kalueff AV, Stewart AM, editors. *Zebrafish protocols for neurobehavioral research*. New York: Humana Press; 2012.
- [11] Johnson MC, Wuensch KL. An investigation of habituation in the jellyfish *Aurelia aurita*. *Behavioral and Neural Biology* 1994;61(1):54–9.
- [12] Dubovicky M, Tokarev D, Skultetyova I, Jezova D. Changes of exploratory behaviour and its habituation in rats neonatally treated with monosodium glutamate. *Pharmacology Biochemistry and Behavior* 1997;56(4):565–9.
- [13] Clay AW, Bloomsmith MA, Marr MJ, Maple TL. Habituation and desensitization as methods for reducing fearful behavior in singly housed rhesus macaques. *American Journal of Primatology* 2009;71(1):30–9.
- [14] Turner SM, Beidel DC, Roberson-Nay R. Offspring of anxious parents: reactivity, habituation, and anxiety-proneness. *Behaviour Research and Therapy* 2005;43(10):1263–79.
- [15] Eisenstein E, Eisenstein D, Smith J. The evolutionary significance of habituation and sensitization across phylogeny: a behavioral homeostasis model. *Integrative Physiological and Behavioral Science* 2001;36(4):251–65.
- [16] Thompson R, Madigan S. *Memory: the key to consciousness*. Princeton: Princeton University Press; 2007.
- [17] Cachat J, Stewart A, Grossman L, Gaikwad S, Kadri F, Min Chung K. Measuring behavioral and endocrine responses to novelty stress in adult zebrafish. *Nature Protocols* 2010;5(11):1786–99.
- [18] Stewart A, Kadri F, DiLeo J, Chung KM, Cachat J, Goodspeed J. The developing utility of zebrafish in modeling neurobehavioral disorders. *International Journal of Comparative Psychology* 2010;23(1):104–21.
- [19] Stewart A, Wu N, Cachat J, Hart P, Gaikwad S, Wong K. Pharmacological modulation of anxiety-like phenotypes in adult zebrafish behavioral models. *Progress in Neuro-Psychopharmacology and Biological Psychiatry* 2011;35(6):1421–31.
- [20] Bergner C, Egan C, Hart P, Cachat J, Canavello P, Kalueff AV. Mutant and transgenic zebrafish in modeling neurobehavioral disorders. In: Kalueff AV, Bergman C, editors. *Transgenic and mutant models of brain disorders*. New York: Humana Press; 2009.
- [21] Best JD, Alderton WK. Zebrafish. An in vivo model for the study of neurological diseases. *Neuropsychiatric Disease and Treatment* 2008;4(3):567–76.
- [22] Miklosi A, Andrew RJ. The zebrafish as a model for behavioral studies. *Zebrafish* 2006;3(2):227–34.
- [23] Grossman L, Stewart A, Gaikwad S, Utterback E, Wu N, Dileo J. Effects of piracetam on behavior and memory in adult zebrafish. *Brain Research Bulletin* 2011;85(1–2):58–63.
- [24] Wong K, Elegante M, Bartels B, Elkhayat S, Tien D, Roy S. Analyzing habituation responses to novelty in zebrafish (*Danio rerio*). *Behavioural Brain Research* 2010;208(2):450–7.
- [25] Levin ED, Bencan Z, Cerutti DT. Anxiolytic effects of nicotine in zebrafish. *Physiology and Behavior* 2007;90(1):54–8.
- [26] MacPhail RC, Brooks J, Hunter DL, Padnos B, Irons TD, Padilla S. Locomotion in larval zebrafish: influence of time of day, lighting and ethanol. *Neurotoxicology* 2009;30(1):52–8.
- [27] Champagne DL, Hoefnagels CC, de Kloet RE, Richardson MK. Translating rodent behavioral repertoire to zebrafish (*Danio rerio*): relevance for stress research. *Behavioural Brain Research* 2010;214(2):332–42.
- [28] Stewart AM, Gaikwad S, Kyzar E, Kalueff AV. Understanding spatiotemporal strategies of adult zebrafish exploration in the open field test. *Brain Research* 2012;1451:44–52.
- [29] Eddins D, Cerutti D, Williams P, Linney E, Levin ED. Zebrafish provide a sensitive model of persisting neurobehavioral effects of developmental chlorpyrifos exposure: comparison with nicotine and pilocarpine effects and relationship to dopamine deficits. *Neurotoxicology and Teratology* 2010;32(1):99–108.
- [30] Levin ED, Aschner M, Heberlein U, Ruden D, Welsh-Bohmer KA, Bartlett S. Genetic aspects of behavioral neurotoxicology. *Neurotoxicology* 2009;30(5):741–53.
- [31] Cachat J, Stewart A, Utterback E, Gaikwad S, Hook M, Rhymes K. Deconstructing adult zebrafish behavior with swim trace visualizations. In: Kalueff AV, Cachat J, editors. *Zebrafish neurobehavioral protocols*. New York: Humana Press; 2010.

- [32] Cachat J, Stewart A, Utterback E, Hart P, Gaikwad S, Wong K. Three-dimensional neurophenotyping of adult zebrafish behavior. *PLoS ONE* 2011;6(3):e17597.
- [33] Grossman L, Utterback U, Stewart A, Gaikwad S, Wong K, Elegante M. Characterization of behavioral and endocrine effects of LSD on zebrafish. *Behavioural Brain Research* 2010;214(2):277–84.
- [34] Moretz JA, Martins EP, Robison BD. Behavioral syndromes and the evolution of correlated behavior in zebrafish. *Behavioral Ecology* 2007;18(3):556–62.
- [35] Wisenden BD, Sailer CD, Radenic SJ, Sutrisno R. Maternal inheritance and exploratory-boldness behavioural syndrome in zebrafish. *Behaviour* 2011;148(14):1443–56.
- [36] Stewart A, Cachat J, Wong K, Gaikwad S, Gilder T, DiLeo J. Homebase behavior of zebrafish in novelty-based paradigms. *Behavioural Processes* 2010;85(2):198–203.
- [37] Maximino C, de Brito TM, da Silva Batista AW, Herculano AM, Morato S, Gouveia Jr A. Measuring anxiety in zebrafish: a critical review. *Behavioural Brain Research* 2010;214(2):157–71.
- [38] Kalueff AV, Murphy DL. The importance of cognitive phenotypes in experimental modeling of animal anxiety and depression. *Neural Plasticity* 2007;2007:52087.
- [39] Mauss IB, Wilhelm FH, Gross JJ. Autonomic recovery and habituation in social anxiety. *Psychophysiology* 2003;40(4):648–53.
- [40] Thayer JF, Friedman BH, Borkovec TD, Johnsen BH, Molina S. Phasic heart period reactions to cued threat and nonthreat stimuli in generalized anxiety disorder. *Psychophysiology* 2000;37(3):361–8.
- [41] Plamondon H, Khan S. Characterization of anxiety and habituation profile following global ischemia in rats. *Physiology and Behavior* 2005;84(4):543–52.
- [42] Egan RJ, Bergner CL, Hart PC, Cachat JM, Canavello PR, Elegante MF. Understanding behavioral and physiological phenotypes of stress and anxiety in zebrafish. *Behavioural Brain Research* 2009;205(1):38–44.
- [43] Westerfield M. The zebrafish book: a guide for the laboratory use of zebrafish (*Brachydanio rerio*). Eugene, OR: Institute of Neuro-Science; 1993.
- [44] Cachat J, Canavello P, Elegante M, Bartels B, Hart P, Bergner C. Modeling withdrawal syndrome in zebrafish. *Behavioural Brain Research* 2010;208(2):371–6.
- [45] Stewart A, Wong K, Cachat J, Gaikwad S, Kyzar E, Wu N. Zebrafish models to study drug abuse-related phenotypes. *Reviews in the Neurosciences* 2011;22(1):95–105.
- [46] Kalueff AV, Keisala T, Minasyan A, Kuuslahti M, Tuohimaa P. Temporal stability of novelty exploration in mice exposed to different open field tests. *Behavioural Processes* 2006;72(1):104–12.
- [47] Lean IJ, Rabiee AR, Duffield TF, Dohoo IR. Invited review: use of meta-analysis in animal health and reproduction: methods and applications. *Journal of Dairy Science* 2009;92(8):3545–65.
- [48] Haidich AB. Meta-analysis in medical research. *Hippokratia* 2010;14(Suppl. 1):29–37.
- [49] Lamprea MR, Cardenas FP, Setem J, Morato S. Thigmotactic responses in an open-field. *Brazilian Journal of Medical and Biological Research* 2008;41(2):135–40.
- [50] Treit D, Fundytus M. Thigmotaxis as a test for anxiolytic activity in rats. *Pharmacology Biochemistry and Behavior* 1988;31(4):959–62.
- [51] Sousa N, Almeida OF, Wotjak CT. A Hitchhiker's guide to behavioral analysis in laboratory rodents. *Genes, Brain, and Behavior* 2006;5(Suppl. 2):5–24.
- [52] Schmidt MV. Animal models for depression and the mismatch hypothesis of disease. *Psychoneuroendocrinology* 2011;36(3):330–8.
- [53] Still AW. On the number of subjects used in animal behaviour experiments. *Animal Behaviour* 1982;30(3):873–80.
- [54] Dingemans NJ, Van der Plas F, Wright J, Réale D, Schrama M, Roff DA. Individual experience and evolutionary history of predation affect expression of heritable variation in fish personality and morphology. *Proceedings of the Royal Society B: Biological Sciences* 2009;276(1660):1285–93.
- [55] Wilson A, Binder T, McGrath K, Cooke S, Godin J. Capture technique and fish personality: angling targets timid bluegill sunfish, *Lepomis macrochirus*. *Canadian Journal of Fisheries and Aquatic Sciences* 2011;68(5):749–57.
- [56] Dingemans NJ, Réale D. Natural selection and animal personality. *Behaviour* 2005;142(9–10):1159–84.
- [57] von Krogh K. Environmental enrichment and its effects on telencephalic neurogenesis and behaviour in isolated adult zebrafish, *Danio rerio*. In: *Molecular biosciences*. Oslo: University of Oslo; 2007. p. 77.
- [58] von Krogh K, Sorensen C, Nilsson GE, Overli O. Forebrain cell proliferation, behavior, and physiology of zebrafish, *Danio rerio*, kept in enriched or barren environments. *Physiology and Behavior* 2010;101(1):32–9.
- [59] Bolivar VJ, Caldarone BJ, Reilly AA, Flaherty L. Habituation of activity in an open field: a survey of inbred strains and F1 hybrids. *Behavior Genetics* 2000;30(4):285–93.
- [60] Salomons AR, Bronkers G, Kirchoff S, Arndt SS, Ohl F. Behavioural habituation to novelty and brain area specific immediate early gene expression in female mice of two inbred strains. *Behavioural Brain Research* 2010;215(1):95–101.
- [61] Hokyo A, Kanazawa T, Uenishi H, Tsutsumi A, Kawashige S, Kikuyama H. Habituation in prepulse inhibition is affected by a polymorphism on the NMDA receptor 2B subunit gene (GRIN2B). *Psychiatric Genetics* 2010;20(5):191–8, <http://dx.doi.org/10.1097/YPG.0b013e32833a201d>.
- [62] Keri S, Seres I, Kelemen O, Benedek G. The relationship among neuregulin 1-stimulated phosphorylation of AKT: psychosis proneness, and habituation of arousal in nonclinical individuals. *Schizophrenia Bulletin* 2011;37(1):141–7.
- [63] Wust S, Federenko IS, van Rossum EF, Koper JW, Hellhammer DH. Habituation of cortisol responses to repeated psychosocial stress—further characterization and impact of genetic factors. *Psychoneuroendocrinology* 2005;30(2):199–211.
- [64] Cachat JM, Canavello PR, Elkhayat SI, Bartels BK, Hart PC, Elegante MF. Video-aided analysis of zebrafish locomotion and anxiety-related behavioral responses. In: Kalueff AV, Cachat J, editors. *Zebrafish neurobehavioral protocols*. New York: Humana Press; 2010.
- [65] de Mooij-van Malsen AJ, Vinkers CH, Peterse DP, Olivier B, Kas MJ. Cross-species behavioural genetics: a starting point for unravelling the neurobiology of human psychiatric disorders. *Progress in Neuro-Psychopharmacology & Biological Psychiatry* 2011;35:1383–90.
- [66] Kas MJ, Krishnan V, Gould TD, Collier DA, Olivier B, Lesch KP. Advances in multidisciplinary and cross-species approaches to examine the neurobiology of psychiatric disorders. *European Neuropsychopharmacology* 2011;21(7):532–44.
- [67] Kas MJ, Fernandes C, Schalkwyk LC, Collier DA. Genetics of behavioural domains across the neuropsychiatric spectrum; of mice and men. *Molecular Psychiatry* 2007;12(4):324–30.
- [68] Kalueff AV, Ren-Patterson RF, LaPorte JL, Murphy DL. Domain interplay concept in animal models of neuropsychiatric disorders: a new strategy for high-throughput neurophenotyping research. *Behavioural Brain Research* 2008;188(2):243–9.
- [69] Kalueff AV, Wheaton M, Murphy DL. What's wrong with my mouse model? Advances and strategies in animal modeling of anxiety and depression. *Behavioural Brain Research* 2007;179(1):1–18.
- [70] LaPorte JL, Egan RJ, Hart PC, Bergner CL, Cachat JM, Canavello PR. Qui non proferit, deficit: experimental models for 'integrative' research of affective disorders. *Journal of Affective Disorders* 2010;121(1–2):1–9.
- [71] Kalueff AV, Schmidt MV. Novel experimental models and paradigms for neuropsychiatric disorders: editorial. *Progress in Neuro-Psychopharmacology & Biological Psychiatry* 2011;35(6):1355–6.
- [72] Cachat JM, Canavello PR, Elegante MF, Bartels BK, Elkhayat SI, Hart PC. Modeling stress and anxiety in zebrafish. In: Kalueff AV, Cachat J, editors. *Zebrafish models in neurobehavioral research*. New York: Humana Press; 2010.