

Automated high-throughput measurement of body movements and cardiac activity of *Xenopus tropicalis* tadpoles

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Competing Interests: The authors have declared that no competing interests exist.

Abbreviations used: DMSO, dimethyl sulfoxide; f(h), heart beat frequency; f(bp), buccal pumping frequency; fps, frames per second; dpf, days post fertilization; ROI, region of interest; bpm, beats per minute; px, pixel

Received June 25, 2014; Revision received September 9, 2014; Accepted October 2, 2014; Published November 5, 2014

ABSTRACT *Xenopus* tadpoles are an emerging model for developmental, genetic and behavioral studies. A small size, optical accessibility of most of their organs, together with a close genetic and structural relationship to humans make them a convenient experimental model. However, there is only a limited toolset available to measure behavior and organ function of these animals at medium or high-throughput. Herein, we describe an imaging-based platform to quantify body and autonomic movements of *Xenopus tropicalis* tadpoles of advanced developmental stages. Animals alternate periods of quiescence and locomotor movements and display buccal pumping for oxygen uptake from water and rhythmic cardiac movements. We imaged up to 24 animals in parallel and automatically tracked and quantified their movements by using image analysis software. Animal trajectories, moved distances, activity time, buccal pumping rates and heart beat rates were calculated and used to characterize the effects of test compounds. We evaluated the effects of propranolol and atropine, observing a dose-dependent bradycardia and tachycardia, respectively. This imaging and analysis platform is a simple, cost-effective high-throughput *in vivo* assay system for genetic, toxicological or pharmacological characterizations.

Keywords: *Xenopus tropicalis*, animal behavior, cardiac imaging, motion analysis, animal tracking, high-throughput *in vivo* assay

INTRODUCTION

Xenopus frogs are excellent vertebrate model organisms for *in vivo* analysis of gene function and are a potential new player for drug discovery and preclinical animal testing [1]. They share many features with human biology and are easy and cost-effective in experimental use. Fertilization can be performed during the whole year which produces a large number of transparent embryos that are freely swimming within one week at room temperature. Many genetic and molecular tools are available including a draft of the diploid genome of *X. tropicalis* that contains approximately 79% orthologs of the human disease genes [2] as well as advanced methods for gene knock down/knockout or transgenesis [3–6]. The evolutionary distance and organ structure of these tetrapods displays a closer proximity to humans than other small aquatic vertebrate animal models, such as zebrafish [7]. An example is the *Xenopus* heart which consists of three chambers (two atria, one ventricle) and is therefore more similar to the four-chambered heart of mammals than the two-chambered heart of fish [8,9]. *Xenopus* embryos have been recently established in high-throughput small molecule screenings, testing many compounds for their ability to cause alterations of pigment

cell development [10], development of the blood vascular or lymphatic system [11] or left-right asymmetry [12]. The experimental procedures in these studies include bath incubation of the compounds that penetrate through the permeable skin, followed by a visual examination of the animal morphology or analysis of the expression pattern of a marker gene in order to access specific developmental alterations [13]. Another small molecule screening strategy used fluorescence measurements of living *Xenopus* embryos that harbor an eGFP reporter for monitoring thyroid hormone function [14]. Altogether, these studies demonstrated that *Xenopus* animals are suitable for compound screenings in multi-well plates. However, thus far vertebrate *in vivo* screenings for neuroactive or cardiotoxic molecules have been performed with zebrafish embryos. In these studies, compound treated animals were explored by using fully automated systems and/or specialized software for alterations of behavioral patterns [15–17] or cardiac activity [18,19]. One of the major obstacles performing such investigations with *Xenopus* tadpoles is the lack of simple and effective high-throughput screening methodologies.

There are several methods to quantify the behavior of *Xenopus* tadpoles that include a state-of-the-art system, performing animal tracking analysis during automated training and learning tasks. It has been used

for demonstrating the learning abilities of *Xenopus* tadpoles [20–22]. A different approach is provided by the multispecies freshwater biomonitor device (LimCo, Germany) that measures animal behavior through spectral analysis of electrical signals caused by animal movements in a test chamber [23]. The EthoVision software (Noldus, Information technology) is a commercial animal tracking software that has been applied for tracking tadpoles of distinct frog species in tanks [24–27]. Due to the relatively large size of tadpoles, the heart beat rates and buccal pumping rates can be measured by visual examination of the animal or from video recordings [28,29]. Other approaches for measuring cardiac function of tadpoles include microscope video analysis [30,31], microstructural analysis with high-resolution imaging techniques [32–34] or microelectrode systems [30,35,36]. However, these methodologies access only behavior or cardiac function, but not both and furthermore,

they can be expensive or require time consuming experimentations.

Here we present a combined approach for automated animal tracking and motion analysis for *in vivo* investigations of *X. tropicalis* tadpoles. We developed a platform for video recording of living tadpoles in multi-well plates that does not require microscope equipment. We also designed software algorithms and experimental procedures for quantitative analysis of locomotor movements, buccal pumping and cardiac activity. The usefulness of the methodologies was verified by *i)* validation of the automated calculations using manual measurements and *ii)* examination of *in vivo* effects of established drug treatments showing agreement with reported results. We conclude that this experimental system provides an attractive platform for cost-effective high-throughput studies.

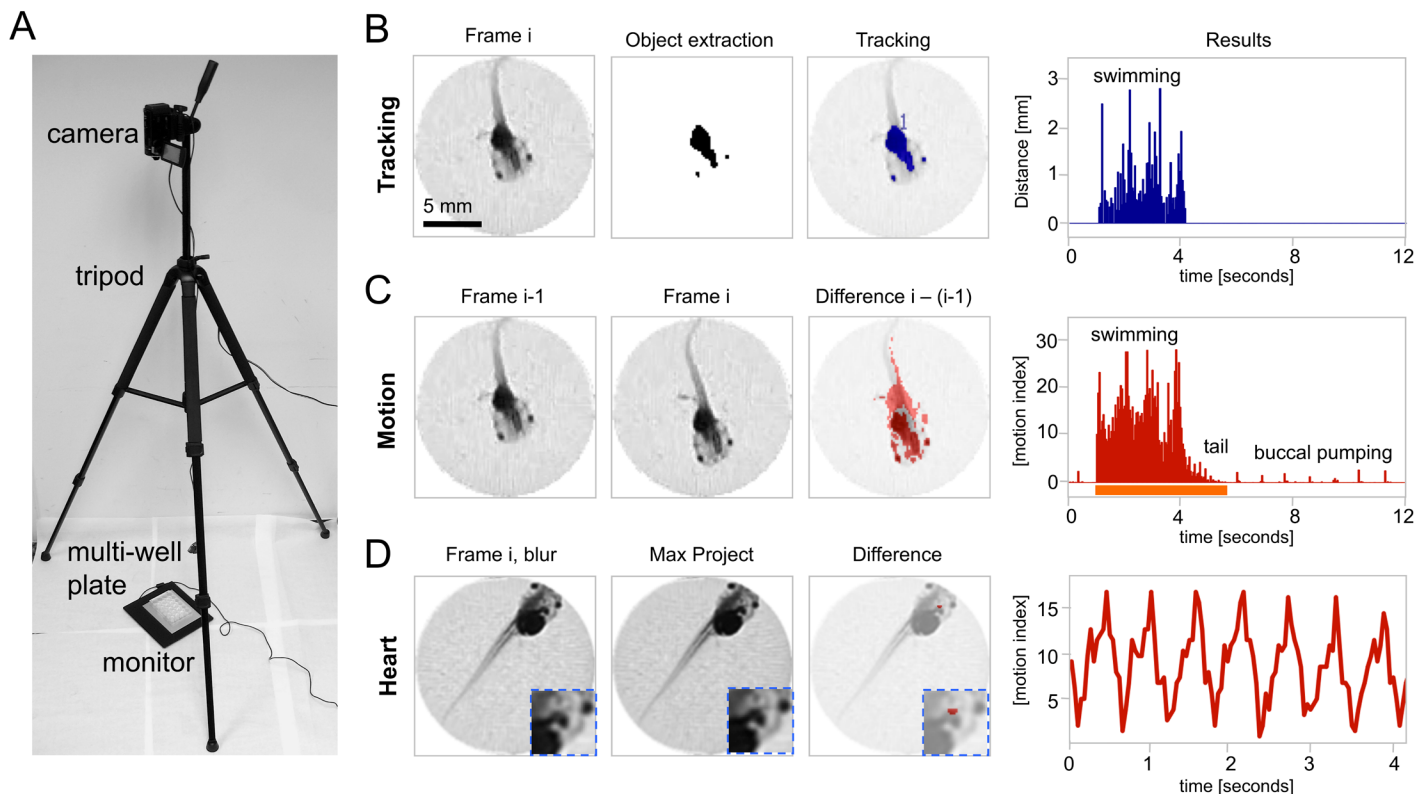


Figure 1. Video recording of *X. tropicalis* tadpoles and principles of image analysis. **A.** The video recording system. Animals in a 24-well plate are transilluminated by a digital monitor and video recorded with a digital camcorder. **B.** Animal tracking: moving objects (blue) are extracted from background and tracked during the experiment. Right panel: representative distance vs. time plot of motility of a tadpole. **C.** Motion analysis: animal movements result in dynamic pixels (red). Right panel: motion index profile of the same sequence as in (A) showing the higher sensitivity of motion analysis to small movements. The movements that correspond to the motion profile are labeled. The orange bar indicates the automatically detected locomotor activity episode. **D.** Cardiac activity: a maximum projection is subtracted from a blurred image. Heart motion results in dynamic pixels (red) that correspond to the dynamic blood-empty regions of the heart. Insets show the amplified heart region. The right panel shows a typical waveform signal of the tadpole heartbeat.

MATERIALS AND METHODS

Animal housing

X. tropicalis embryos (Nasco) were obtained by natural mating and maintained till 3–4 dpf in 0.1 × Marc’s modified Ringer’s (MMR) solution in agarose coated petri dishes (10–15 cm diameter) in a dark incubator (24°C). Animals were transferred to tanks containing *Xenopus* water, which was prepared by adding 8 g of instant ocean salt (Instant Ocean) to 20 L of distilled water. Conductivity and pH were 800 μ S and 7.4–7.5, respectively. Tadpoles were kept at a density of 30–50 animals

L⁻¹, at 25°C and fed daily with spirulina. All procedures complied with the standards of the ethical commission of the University of Barcelona and the Generalitat of Catalunya.

Treatments

Tadpoles were staged according to Nieuwkoop and Faber [37]. The pH of water was adjusted to 6.8–7.2 after addition of drugs.

Behavior assay

Tadpoles were distributed in 24-well plates (diameter: 15.6 mm/well) and water was replaced by 1.2 ml water supplemented with 1%

DMSO (dimethyl sulfoxide) as vehicle control of drug assays. One minute duration video recordings, to show basal activity of animals, were obtained after tadpoles were undisturbed on the video recording platform for 30 min.

Cardiac activity assay

Animals were distributed in 24-well plates and water was replaced by 400 μ l immobilization solution (0.02% tricaine, Ethyl 3-aminobenzoate methanesulfonate (MS222) in *Xenopus* water) only, or additionally

supplemented with propranolol or atropine (Sigma-Aldrich, Cat no. P0884 and A0132) at the indicated concentrations. When being completely immobile, tadpoles were moved into ventral side up position using a pipette tip. 10 min after addition of drugs, the plate with the animals was video recorded for 15 seconds to access cardiac activity.

Toxicity of tricaine treatment

Tricaine treated animals ($n = 28$) were transferred into water for recovery and observed 3 days later for abnormalities or death.

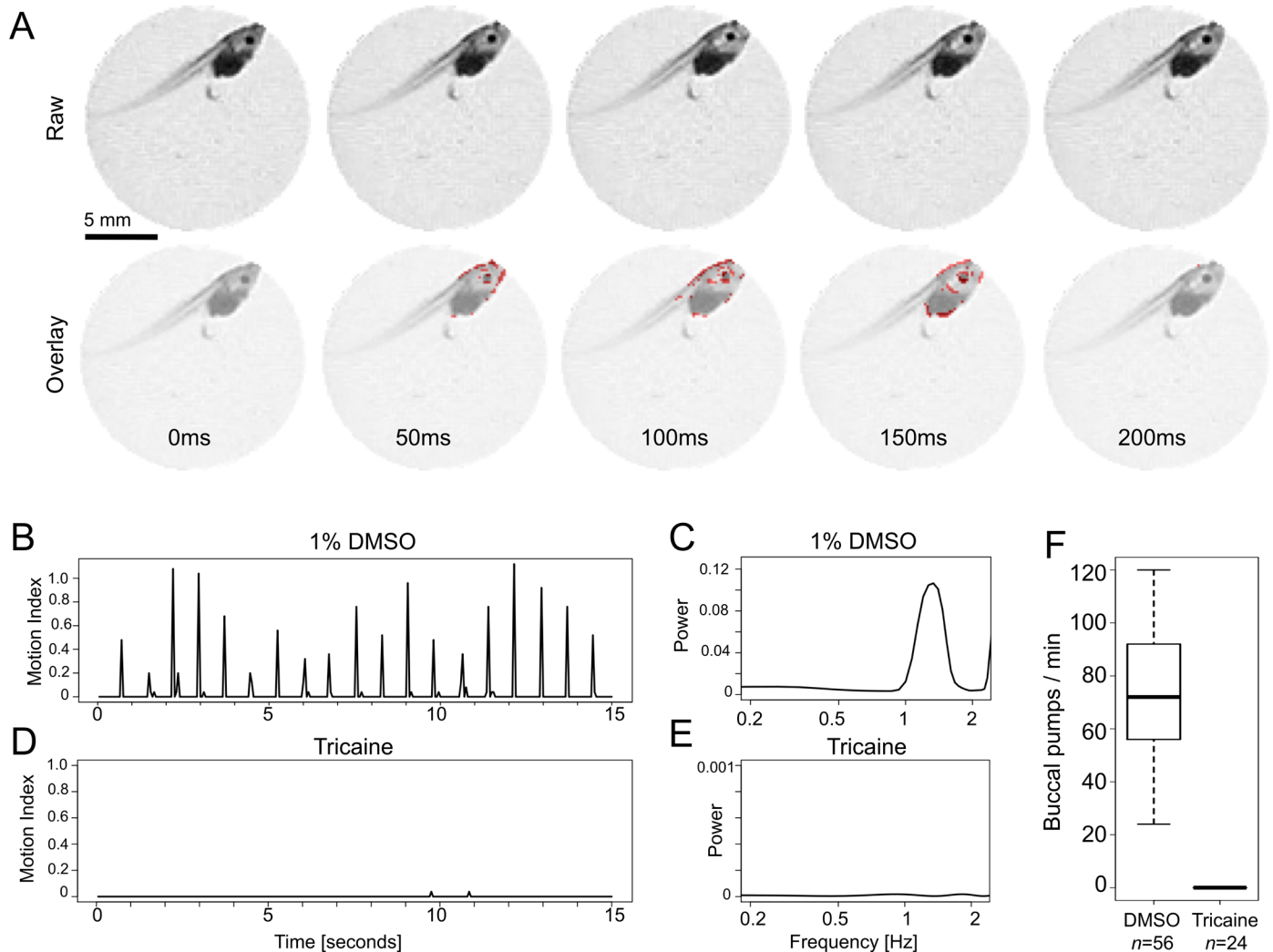


Figure 2. Buccal pumping of a *X. tropicalis* tadpole. **A.** Image sequence (upper panel) and overlay images with dynamic pixels (lower panel, red pixels) of an animal in lateral position performing one buccal pumping. **B.** Representative plot of buccal pumping of an untreated animal (DMSO control) during 15 seconds. Every peak corresponds to one cycle of mouth opening and closing shown in (A). **C.** The corresponding power spectrum signal, showing a main peak at 1.3 Hz that corresponds to the frequency of buccal pumping. **D-E.** Tricaine treatment abolished buccal pumping. **F.** Boxplot of buccal pumping rates of control (DMSO) and tricaine treated animals.

Tadpole imaging

The video recording platform (Fig. 1A) was placed in a sparsely illuminated room. Animals were recorded from 1.55 m height with a remote triggered Sony Handycam HDR-CX210 (1920 \times 1080/60i, 30 fps). Constant transillumination was applied bottom-up by a digital monitor (DigiFrame 8000 SLT, Braun) displaying a blank image. The video streams were first converted to .mov files (iMovie program, v. 8.0.6) and processed as follows depending on the assay.

For the behavior assay, .mov files were converted into medium

resolution image sequences using the QuickTime export function of iMovie (format: 960 \times 540 px, 20 frames per second (fps), .tiff, uncompressed, 8-bit grayscale). For cardiac activity assay, .mov files were converted into high-resolution image sequences (format: 1920 \times 1080 px, 25 fps, .tiff, uncompressed, 8-bit grayscale) with the MPEG Streamclip converter program (v. 1.9.2).

Image analysis

Image analysis was performed on image sequences with ImageJ macros (v.1.46, [38]) that loop over a list of regions of interest (ROI's),

namely the circular wells of the multi-well plate (behavior assay) and even-sized ROI's (area = 535 pixel) placed on the heart regions of the animals (cardiac activity assay).

Behavior assay

The macro for tracking tadpoles was based on the wrMTrack methodology from Jesper Søndergaard Pedersen. The plugin and a detailed description for animal tracking can be found at: <http://www.phage.dk/plugins>. Briefly, constant elements were removed from images by subtraction of a maximum projection and images were binarized upon threshold, leaving only dark and moving objects (mainly the intestines of the tadpoles) that were tracked with the wrMTrack plugin (**Fig. 1B**). Distances were calculated as distances moved by all tracked objects per well from filtered raw data with filtering parameters set to filter out unspecific movements. Control measurements were performed for 10 second intervals by manual tracking of the estimated center of the animals intestine using the MTrackJ plugin [39] and compared to their

automatic measurements.

The macro for motion analysis performed a frame-to-frame subtraction, starting from the last frame of the image sequence and extracting the dynamic pixels that change intensity above a threshold. Dynamic pixels were then binarized and the mean pixel intensity per ROI area was calculated with the ImageJ Multi-Measure tool (**Fig. 1C**). These motion measurements correlate with the number and the size of objects that are in motion and the frequency of the movements. Locomotor activity time was calculated by a roll-apply function (`library(zoo)[40]`, window width: 20 frames, `quantile-25 > 0`) that discriminates motion signatures of tadpoles' locomotor activity (swimming and tail flickering) from those of quiescent periods. Buccal pumping rates were measured from the main peak in the range 0.2-2.2 Hz of frequency spectra calculated from motion signal data of 15 second intervals (4 intervals per minute). Therefore, four measurements for each animal were obtained and one was chosen after visual inspection of the plotted data. In a few cases values were corrected manually.

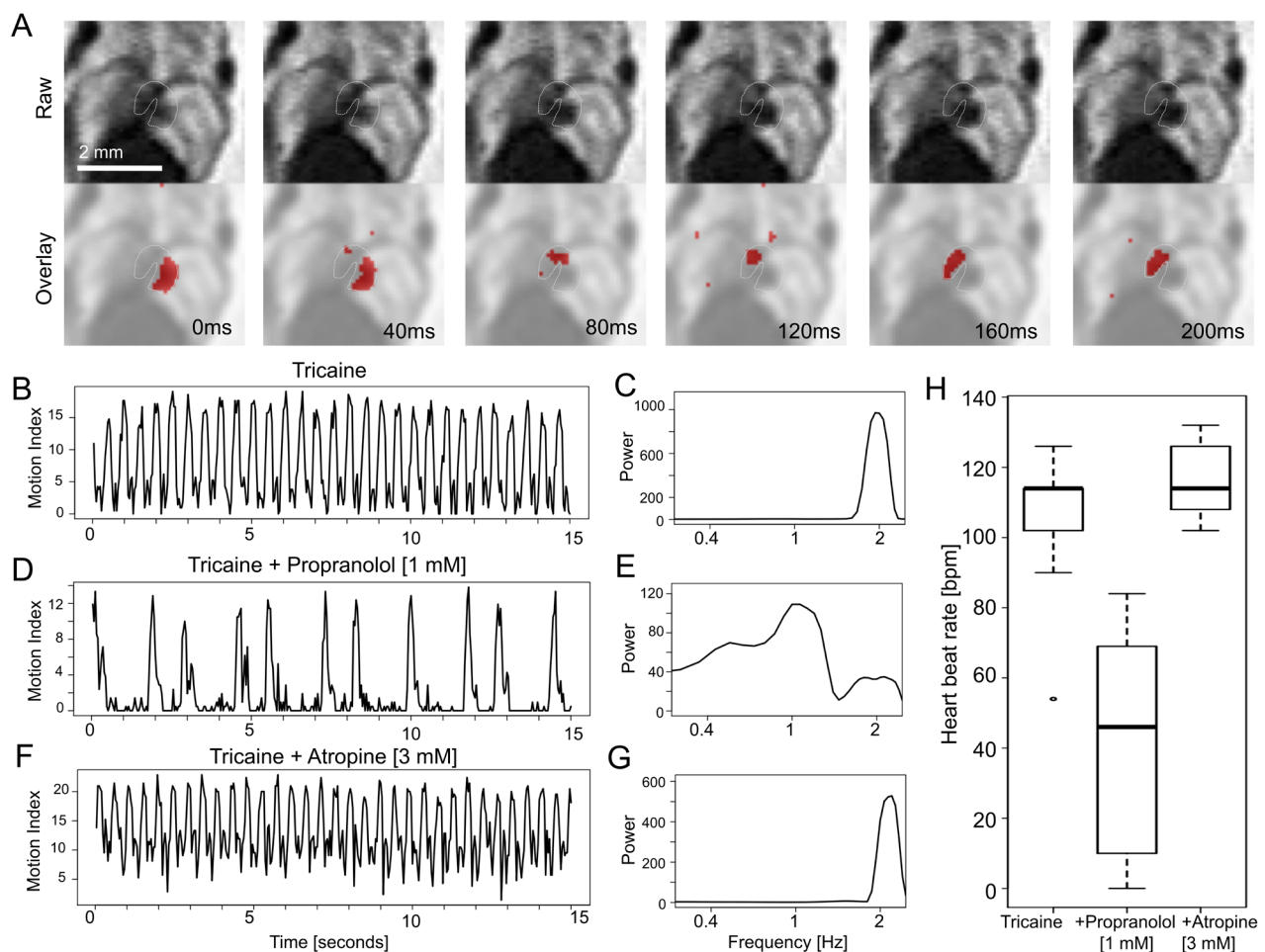


Figure 3. Effect of propranolol and atropine on *X. tropicalis* cardiac activity. **A.** Raw image sequence (upper panel) and overlay of processed image with dynamic pixels (lower panel, red pixels) of cardiac activity of a representative tadpole in ventral position. Dashed lines indicate the fully expanded heart area where dynamic pixels occur. **B-C.** Representative plot of cardiac signals from a tadpole treated with tricaine alone over 15 seconds. **(C)** The corresponding power spectrum shows a peak at 1.9 Hz that corresponds to the $f(h)$. **D-E.** Propranolol [1 mM] treatment decreases $f(h)$ and causes arrhythmia, which is characterized by multiple peaks in the power spectra. **F-G.** Atropine [3 mM] treatment causes tachycardia ($f(h) = 2.2$ Hz). **H.** Boxplot showing the distribution of heart beat rates for treatments; tricaine ($n = 39$), propranolol ($n = 20$), atropine ($n = 19$).

Cardiac activity assay

Images were blurred and constant elements were removed by subtracting a maximum projection. Dynamic pixels were binarized above

threshold and the mean pixel intensity per ROI area was measured with the ImageJ Multi-Measure tool (**Fig. 1D**). The highest signals correspond to dynamic blood-empty regions of the beating heart (**Fig.**

3A, Movie S2). For automated calculation of heart beat rates, a software script was used to filter out low frequencies and to calculate the frequency spectrum of the signal. The heart beat frequency $f(h)$ was measured from the main peak in the range 0.4-2.3 Hz of frequency spectra calculated from heart beat signals of a 15 second period. Very low signal amplitudes indicated cardiac arrest and the $f(h)$ was set to 0. Data were plotted for control and corrected manually if necessary. If cardiac activity of a single animal per treatment group was undetectable, it was removed from analysis.

Statistical analysis

Data calculations, statistical analysis and graphical presentations were performed with custom R scripts (v.2.15.2). Numerical data in the text are represented as mean \pm SEM and the differences for each treatment condition relative to controls were assessed separately using a Welch two-sample t-test and a P -value correction for multiple testing [41]. Correlation between automated and manual distance measurements was assessed with the R^2 correlation coefficient. Automated and manual locomotor activity time measurements were first classified into four groups, 0-1 s, 1-25 s, 25-50 s, 50-60 s corresponding to: no activity, moderate activity, high activity and very high activity, respectively. Then, the weighted kappa coefficient (κ_w) was calculated to assess the level of agreement between automated and manual measures. Semi-automatic measures of heart beat frequency and frequency of buccal pumping were considered as correct within ± 0.1 Hz compared to manual measurements that were obtained by manual counting from video material.

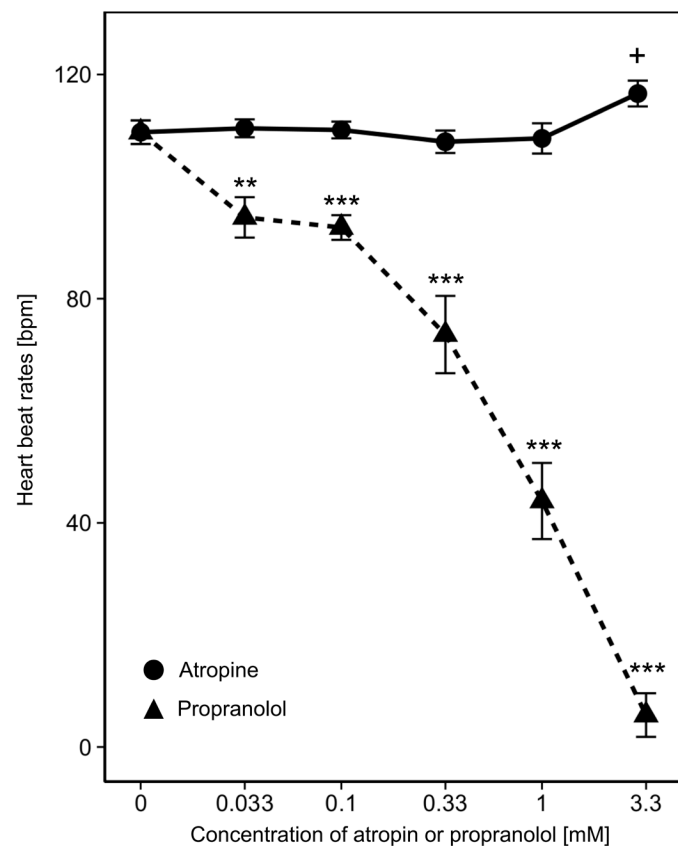


Figure 4. Concentration dependent effect of atropine and propranolol on *X. tropicalis* cardiac activity. Heart beat rates of tadpoles were measured after 10 min treatment with tricaine alone (control), or additionally supplemented with the indicated concentrations of propranolol or atropine. Control animals and treatments with atropine or propranolol were significantly different as indicated by asterisks, ** $P < 0.01$ and *** $P < 0.001$

< 0.001 or atropine [3 mM] with + $P = 0.068$. Tricaine alone ($n = 39$, 10 independent experiments); atropine, circles and solid line ($n = 19$ to 20, 5 independent experiments); and propranolol, triangles and dashed line ($n = 20$, 5 independent experiments).

RESULTS

Platform

We developed a platform for video recording *X. tropicalis* tadpoles that consists of a digital monitor for transillumination and a digital camcorder that is placed afar of the animals to avoid blind angles around the well edges. We recorded entire 24-well plates containing tadpoles of stage 48-50 that remained healthy and motile under these conditions. Video streams were of sufficient spatial resolution to document tadpole dimensions or estimate the developmental stage and allow observation of small body compartments such as tail, mouth and the heart (Fig. 1-3).

Behavior assay

Video sequences were automatically processed on each well using two distinct image analysis methods: tadpole tracking and motion analysis (Fig. 1B-C; Materials and Methods). The tracking software calculated the moved distances with high accuracy (Table 1). Motion analysis is a frame-to-frame evaluation of the overall motion per well. Analysis of individual animals revealed stereotypical patterns of different motion signal intensities and densities, corresponding to different types of movements that would be otherwise largely unexplored by the tracking method (Fig. 1C, Movie S1). Tadpole activity episodes occurred spontaneously, combining sequences of swimming, or tail flickering while maintaining the xy body position. These activities resulted in signals of high frequency and at different signal intensities depending on the frame-to-frame displacement of the animal. We analyzed body movements of 80 individual tadpoles during 1 minute intervals. On average animals performed locomotor activity during 16 ± 2 seconds (i.e. were mobile during $\sim 27\%$ of imaging time) and moved 76 ± 12 mm. For the remaining $\sim 73\%$ of time, animals remained quiescent and performed autonomic movements characterized by buccal pumping for oxygen uptake from water, which occurred as rhythmic mouth opening and closing (Fig. 2A). Buccal pumping was also seen as back and forth ticking of the animals (Movie S1). Buccal movements occurred as sharp and repeated peaks of low intensity in motion analysis plots (Fig. 2B). The spectral analysis of these periodic signals revealed a main peak corresponding to the animals buccal pumping frequency, from which the buccal pumping rates were calculated (Fig. 2C, Table 1). Measurements from 56 out of 80 tadpoles showed buccal pumping rates between 24 - 120 pumps per minute (Fig. 2F). The remaining 24 tadpoles were not accessible due to continuous locomotor activities that interfered with small buccal pumping signals. In order to validate this method we evaluated tricaine treated animals that are paralyzed and do not ventilate. As expected, no buccal pumping or locomotor signals appeared in motion plots and spectral analysis (Fig. 2D-F), showing that at least such dramatic alteration of tadpole activity can be automatically detected.

Cardiac activity assay

We set a novel cardiac activity assay for processing up to 24 animals in parallel. The methodology was used to measure heart beat rates from tadpoles (Fig. 1D, Materials and Methods). Animals were shortly anesthetized with tricaine (10 min), righted into ventral-up position to make the cardiac system accessible for video recording and automated image analysis for measuring the heart beat rates was performed (Movie S2).

38/40 of tricaine treated *X. tropicalis* tadpoles showed robust cardiac activity that occurred as waveform signals. Spectral analysis was used to measure the heart beat frequency with high accuracy (Fig. 3, Table 1).

In order to evaluate the usefulness of the cardiac activity assay for pharmacological studies, we compared control animals and animals treated with increasing concentrations of the established chronotropic drugs that cause reduction of cardiac activity (propranolol) or increase cardiac activity (atropine) (Fig. 3-4). Heart beat rates of control animals (tricaine alone) were 109.7 ± 2.1 beats per minute (bpm) and no irreversible effects or dead animals were found when animals were

observed 3 days after tricaine washout. The rhythmic heart beat rates seen in control animals were significantly lowered with increasing doses of propranolol. At highest concentrations most animals showed cardiac arrest or slow and arrhythmic heart beats (propranolol [1 mM] = 43.9 ± 6.8 bpm, propranolol [3.3 mM] = 5.7 ± 3.9 bpm, both significantly different to controls with $P < 0.001$). In contrast, treatment with 3 mM atropine, an antagonist of parasympathetic muscarinic receptors, had the opposite effect and cardiac activity increased to 116.2 ± 2.3 bpm ($P = 0.068$). Treatment with lower atropine doses did not result in significant differences compared to control animals.

Table 1. Correlation between manual and automated measurements.

Parameter	Observation	n
Distance [†]	auto = $0.94 \times \text{manual [cm]} + 0.4 \text{ [cm]}$, $R^2 = 0.99$	30
Activity time [§]	$\kappa_w = 0.95$	80
Buccal pumping frequency	auto = manual ± 0.1 Hz, 100%	51
Heart beat frequency	auto = manual ± 0.1 Hz, 97%	144

[†]Distance: the function used to fit the data is presented together with the correlation coefficient R^2 . [§]Activity time: According to the criteria reported by Landis and Koch [46], the strength of agreement of a weighted kappa coefficient of $\kappa_w = 0.95$ was "almost perfect". f(bp) - buccal pumping frequency, f(h) heart beat frequency.

DISCUSSION

Quantitative *in vivo* analysis of *Xenopus* tadpoles provides an attractive tool for neurological, physiological or eco-toxicological studies. In addition, tadpoles seem to be an ideal tool for early stages of the drug development process including the identification of novel drug candidates or exclusion of drugs with unfavorable properties [7]. Such investigations often require the analysis of hundreds or thousands of samples thus raising the need for new high-throughput methodologies for experimentation, monitoring and analysis of tadpoles. Our goal was the development of an effective system that largely fulfils these criteria, and we presented methodologies showing a combination of advantages over existing methods.

First, the experimental approach is based on an advanced model organism with great potential to genetics and pharmacology. *Xenopus* tadpoles display a high evolutionary proximity to mammals and good experimental usability. Importantly, we used these animals at pre-metamorphic stages with most of the organs and neuronal structures being developed and functional. These animals are capable of performing complex behavior trials and show learning abilities and social interactions [21,22,26,27,42,43]. Such features are mostly not established in embryos thus, favoring the tadpole model for experiments estimating effects on human health. Besides the advantage of testing an advanced organism, our methods benefit from the favorable animals' dimensions that permit parallel measurement of body movements and small body compartments without the need for special microscope equipment or genetically modified organisms.

Second, it was possible to obtain multiple readouts. We established protocols for quantitative assessment of tadpole body movements, buccal pumping and heart beat rates by using the same platform. This strategy allows rapid testing of different biological features without the need for multiple equipments. So far these assays could be performed only separately in different setups instead of combined as described here.

Third, we defined a high-throughput assay. Experiments were performed in 24-well plates that allow high-throughput experimentation

and permit tadpoles to perform locomotor activities in the well area. However, other plate formats (6 or 12 well) or dishes might be considered in order to overcome spatial restrictions. The cardiac activity assay was performed at a throughput of approximately ~100 animals per hour which is comparable to established high-throughput assays with transgenic zebrafish embryos [18,19]. In addition, data analysis protocols were largely automated thus, decreasing processing time and inter-experimental variability. A further increase in throughput might be achieved by optimization of the testing procedure, for example by parallel processing of several multi-well plates.

Fourth, the cost of the experimental system is moderate and it does not require fluorescence microscopy and sensitive CCD cameras. High quality video recordings of tadpoles were obtained by using consumer-imaging equipment and most computer programs are freely available for Windows, Mac and Linux operating systems.

And fifth, the setup is mobile. The platform can be installed and uninstalled quickly and therefore it takes up laboratory space only when being used. In addition, it can be applied to field studies where no energy supply is available by using a battery driven digital screen from a tablet or laptop computer for illumination.

We analyzed tadpole movements by two strategies, animal tracking and motion analysis that are both useful and with several advantages. Tracking of tadpoles by their xy positions allows the extraction of kinetic parameters such as the moved distance that has been shown useful for accessing animals' motility in behavioral assays [42]. However, it is insufficient for detection of small movements that occur during buccal pumping or tail flickering. Therefore, we applied motion analysis for quantification of pixel intensity changes due to movements of the animal followed by automated analysis of the signals. This approach allowed us to extract important features such as buccal pumping rates and locomotor activity time. The incorporation of holistic spectral analysis of the motion analysis signals [45] could enable the automatic detection of many more movement parameters such as tail beat frequencies or temporal patterns of movements. By using tracking and motion analysis, we analyzed basal activity of tadpoles and found

that tadpoles in 24-well plates are mainly immobile while performing buccal pumping at variable frequency. This is a direct difference to anesthetized or dead animals, which do not pump and can be identified automatically by this method. We believe that this is a particular useful measurement to perform dose-dependent relationships in toxicological analysis of pollutants. The portability of the system together with the straightforward interpretation of results could make our methodology a valuable tool in field studies.

The tadpole heart is an established model system for *in vivo* studies of this organ due to its quick development, optical accessibility and structural similarities to mammalian hearts. We analyzed tadpole cardiac activity with a high-throughput methodology. During the experiments, animals anesthetized for a short and defined incubation time had only small variations in their heartbeats, indicating that this treatment had only moderate effects on tadpole cardiac activity. We validated this methodology and analyzed alterations of cardiac activity that were induced by established drugs. Propranolol is a β -adrenergic receptor antagonist that slows down heart conduction of mammalian and *Xenopus laevis* tadpole hearts [30]. In agreement with these results, *X. tropicalis* tadpoles responded with a decrease of heart beat rates (bradycardia) and showed arrhythmic figures. In contrast, atropine caused an increase of *X. tropicalis* heart beat rates (tachycardia) suggesting an interference with the parasympathetic control of cardiac activity [30]. These observations showed that our cardiac activity assay is a useful tool for high-throughput *in vivo* studies relevant to humans, since characteristic pharmacology responses of the human heart are reproduced in *Xenopus*.

In summary, we have presented the development and validation of an image-based platform for *in vivo* analysis of *Xenopus* tadpoles. We analyzed body movements and cardiac activity at high resolution and high-throughput. The easy implementation and straightforward interpretation of results makes this image-based platform an ideal cost-effective methodology for screening of potential toxins and drugs affecting motor and autonomous nervous system functions.

Acknowledgments

We would like to thank Beatrice Terni for help with natural matings and Sébastien Tosi for critically reviewing the ImageJ Tracking macro. Daniel Cuadras (IDIBELL) for statistical advice, Simone Vitiello for help with the ImageJ macros and Héctor Sanz-García for help with the tadpole experiments. We acknowledge financial support from the RecerCaixa foundation (2010ACUP00378), Fundació La Marató de TV3 (111531), the European Union's Seventh Framework Programme for research, technological development and demonstration under grant agreements 270483 (Focus), 210355 (Opticalbullet) and 335011 (Theralight), the Catalan government (grant 2014SGR-1251) and the Spanish government (grants CTQ2008-06160, CTQ2013-43892R, SAF2012-36375).

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Supplementary information

Movie S1. Behavior assay of a *X. tropicalis* tadpole. This compressed video sequence shows the raw image sequence and image analysis data of the behavior assay of a tadpole in a 24-well plate. Overlay with data from animal tracking (blue, middle panel) and dynamic pixels from motion analysis (red, right panel) are presented in the upper panel and the corresponding animated plots of the signals are shown in the lower panel. The animal is quiescent while performing buccal pumping (back and forth ticking), and then it performs a locomotor activity episode and returns being quiescence.

Movie S2. Cardiac activity analysis of a *X. tropicalis* tadpole. Compressed video sequence showing representative video analysis of the beating heart of an anesthetized tadpole over 5 seconds. Upper left: raw image sequence, Upper right: overlay of the raw image sequence and motion analysis sequence with dynamic pixels (red). Lower panel: animated plot of motion signal.

Supplementary information of this article can be found online at <http://www.jbmethods.org>.