Measuring complex phenotypes: A flexible high-throughput

2

design for micro-respirometry

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4 Amanda N. DeLiberto^{1*}, Melissa K. Drown¹, Marjorie F. Oleksiak¹, Douglas L. Crawford¹

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- ⁶ ¹ Department of Marine Biology and Ecology, Rosenstiel School of Marine and Atmospheric
- 7 Science, University of Miami, Miami, FL, USA

- 9 *Corresponding author:
- 10 E-mail: amanda.deliberto@rsmas.miami.edu (AD)
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18 Abstract

19 Variation in tissue-specific metabolism between species and among individuals is thought to be 20 adaptively important; however, understanding this evolutionary relationship requires reliably 21 measuring this trait in many individuals. In most higher organisms, tissue specificity is important 22 because different organs (heart, brain, liver, muscle) have unique ecologically adaptive roles. 23 Current technology and methodology for measuring tissue-specific metabolism is costly and 24 limited by throughput capacity and efficiency. Presented here is the design for a flexible and 25 cost-effective high-throughput micro-respirometer (HTMR) optimized to measure small 26 biological samples. To verify precision and accuracy, substrate specific metabolism was 27 measured in heart ventricles isolated from a small teleost, Fundulus heteroclitus, and in yeast (Saccharomyces cerevisiae). Within the system, results were reproducible between chambers and 28 29 over time with both teleost hearts and yeast. Additionally, metabolic rates and allometric scaling 30 relationships in *Fundulus* agree with previously published data measured with lower-throughput 31 equipment. This design reduces cost, but still provides an accurate measure of metabolism in small biological samples. This will allow for high-throughput measurement of tissue metabolism 32 that can enhance understanding of the adaptive importance of complex metabolic traits. 33

34 Introduction

35	Understanding evolution and ecological adaptation can be enhanced by combining					
36	genomics with quantitative analyses of complex phenotypic traits [1]. This integrative approach					
37	requires sufficient sample size (i.e. 100s to 1000s) with precise measure of phenotypes, however					
38	it can be challenging to obtain economical equipment for such high-throughput quantification.					
39	To address this challenge, we present an inexpensive custom design to measure metabolism in					
40	small biological samples such as cell suspensions, individual tissues or possibly small organisms					
41	Metabolism is a complex trait intricated in most physiological processes and is important to					
42	organismal success. Thus, metabolism is ecologically and evolutionarily important [2–11]. The					
43	effect of the environment on metabolism as well as tissue-specific variation can vary					
44	considerably among individuals and populations [12–18]. These and other data suggest that					
45	measuring metabolism can provide insights into the ecology and evolution of organisms [5].					
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57 system by measuring both *Saccharomyces cerevisiae* and substrate specific metabolism in

58 Fundulus heteroclitus heart ventricles.

59 Materials and methods

60 Instrumentation

61 The HTMR consists of a custom external plexiglass water bath designed to enclose 1-ml 62 micro-respiration chambers (Unisense) (Fig 1A). The water bath is connected to a temperaturecontrolled, re-circulating system, and placed on a multi-place stir plate. Each chamber contains a 63 stir bar and nylon mesh screen for mixing media while keeping tissues suspended (Fig 1B). 64 65 Exact chamber volumes were determined by measuring the mass (to 0.001 g) of water that completely filled individual chambers with the mesh screen and stir bar. A fluorometric oxygen 66 67 sensor spot (PreSens) is adhered to the internal side of the chamber lid with a polymer optical 68 fiber cable affixed to each chamber lid for contactless oxygen measurement through the sensor 69 spot. All cables are connected to a 10-channel microfiber-optic oxygen meter (PreSens), which 70 uses PreSens Measurement Studio 2 software to collect oxygen data at a sampling rate of 20 measurements per minute. Sensors were calibrated at 0% (using 0.05 g sodium dithionite per 1 71 72 ml of media) and 100% air saturation (fully oxygenated media). Validation of the HTMR was 73 carried out using a four-chamber system; however, it can easily be extended to a 10-chamber 74 system as in Fig 1A.

Fig 1. Ten chamber high-throughput micro-respirometer (HTMR). (A) PreSens 10-channel oxygen meter with fiber optic cables connected via contactless oxygen sensor spots in each chamber. Glass chambers are sealed in a water bath for constant temperature control, positioned on a stir-plate to circulate the media within each individual chamber. A temperature probe is connected and placed in the water bath to monitor temperature. (B) Individual chamber design, with Unisense 1 ml micro-respiration chamber, modified with a contactless sensor spot adhered to

the inner surface of the lid and a stir bar below a nylon mesh screen. The fiberoptic cable is attached to the lid
adjacent to the sensor spot. (C) General schematic of experimental metabolic measurements in teleost ventricles.
Each ventricle is measured in each substrate for six minutes and then placed in the following substrate while
exchanging chamber media. Substrate conditions are measured as follows: 1) 5 mM glucose; 2) 1 mM palmitic acid;
3) 5 mM lactate, 5 mM hydroxybutyrate, 5 mM acetoacetate, and 0.1% ethanol; and 4) endogenous metabolism with
no substrate. Glycolytic enzyme inhibitors (10 mM iodoacetate and 20 mM 2-deoxyglucose) are added to fatty acid,
LKA, and endogenous conditions to inhibit residual glycolytic metabolism.

87 Metabolic rate determinations

The precision and accuracy of the HTMR was validated by measuring MO_2 in both yeast 88 (Saccharomyces cerevisiae) and teleost (F. heteroclitus) heart ventricles. MO₂ is measured in the 89 sealed chambers by measuring oxygen concentration at a rate of 20 measurements per minute, 90 91 over a six-minute period. During each daily measurement, a minimum of three blank measurements, during which only media was in the chamber, were run to determine any 92 93 background flux. For each six-minute measurement, the last three minutes (60 datapoints) were used for calculating metabolic rate. To do so, oxygen concentration was regressed against time to 94 determine the raw oxygen consumption rate (pmol*µl-¹*min⁻¹). Slopes were also calculated for 95 96 each blank measurement and averaged by chamber to quantify background flux, then subtracted from each slope. Metabolic rate was measured as $MO_2 = (M_{sample} - M_{blank}) * V_{chamber} * 1/60$, 97 where MO_2 is the final metabolic rate in pmol*s⁻¹, M is the slope of oxygen consumption per 98 99 sample in pmol* μ l⁻¹*min⁻¹, and V is the volume of each chamber in μ l. PreSens datafiles provide data per sensor with oxygen concentration (μ mol*L⁻¹) at each 100 101 time point (minutes). An R markdown file detailing this analysis of the raw PreSens data files 102 can be found at https://github.com/ADeLiberto/FundulusGenomics.git.

103 **Experimental Organisms**

104	Fundulus heteroclitus were collected using wire minnow traps from Cape Cod, MA, Mt.
105	Desert Island, ME, and Deer Isle, ME. Individuals were trapped on public land, and no permit
106	was needed to catch these marine minnows for non-commercial purposes. All fish were common
107	gardened at 20°C and salinity of 15 ppt in re-circulating aquaria for at least five months and then
108	acclimated to 12°C or 28°C for at least two months prior to metabolic measurements. Fish were
109	randomly selected, weighed, and then sacrificed by cervical dislocation. Heart ventricles were
110	isolated and immediately placed in Ringer's media (1.5mM CaCl ₂ , 10 mM Tris-HCl pH 7.5, 150
111	mM NaCl, 5mM KCl, 1.5mM MgSO ₄) supplemented with 5 mM glucose and 10 U/ml heparin to
112	expel blood. Media was incubated at the measurement temperature prior to use. Ventricles were
113	then splayed following precedent of previous cardiac metabolism measurements in F .
114	heteroclitus [19]. Splaying the hearts decreases variation and increases overall oxygen
115	consumption rates, as greater internal surface area is exposed to the substrate media [20]. After
116	splaying, hearts were not further stimulated, as mechanical disruption or homogenization can
117	increase variability in oxygen consumption rates [15]. All animal husbandry and experimental
118	procedures were approved through the University of Miami Institutional Animal Care and Use
119	Committee (Protocol # 19-045).

120 Methodological validation

121 In order to validate the HTMR performance, several parameters were tested: 1) net flux at 122 multiple oxygen concentrations, 2) between-chamber variability in MO₂, and 3) consistency of 123 MO₂ over time. To quantify net flux and confirm equal rates between chambers, flux was 124 measured at multiple oxygen concentrations in each chamber. Here we define net flux as both

background oxygen consumption and oxygen diffusion into the system. Flux at 100% air 125 126 saturation was measured with fully oxygenated Ringer's media. To measure net flux at lower 127 oxygen saturations, Ringer's media was deoxygenated to the desired level with nitrogen gas. 128 85% air saturation was chosen because cardiac MO₂ measurements over the six minutes typically 129 deplete oxygen to approximately 92% of air saturation but do not exceed 85%. To determine net 130 flux, oxygen concentration was measured in each chamber for 10 minutes and repeated in triplicate. 131 132 Biological repeatability between chambers was tested with yeast at 28°C. A cell suspension was prepared using 1 g of yeast per 10 ml of Ringer's media supplemented with 5 133 134 mM glucose. In each chamber, 100 μ l of the suspension was injected to account for variation in 135 chamber volume. Oxygen consumption was measured for 10 minutes in triplicate. MO₂ was calculated as above to confirm there were no differences among chambers. 136 137 In order to assess metabolic consistency over the time-course of the experiment as well as 138 chamber repeatability, hearts from four fish were isolated, and glucose metabolism was assayed 139 in each chamber at 28°C. Hearts were randomly assigned to one of the four chambers and cycled 140 through each of them, with media exchange between each measurement. Three blank 141 measurements were run at the conclusion of the experiment. MO₂ was calculated as above and then regressed against relative time of initial oxygen measurement per cycle to determine 142 143 metabolic rate consistency of heart tissue over time. **Substrate Specific Metabolism** 144

For teleost ventricles, substrate specific metabolism was measured under four conditions:
1) 5 mM glucose, 2) fatty acids (1mM Palmitic acid conjugated to fatty-acid free bovine serum

albumin), 3) LKA: (5mM lactate, 5mM hydroxybutyrate, 5 mM ethyl acetoacetate, 0.1% 147 148 ethanol) and 4) non-glycolytic endogenous metabolism (no substrate). With the exception of 149 glucose measurements, glycolytic enzyme inhibitors (20 mM 2-deoxyglucose and 10 mM 150 iodoacetate) were added to all substrates to inhibit residual glycolytic activity. These substrate concentrations are commonly used for assaying substrate metabolism in teleost ventricles [19– 151 152 22]. As outlined above, MO₂ was measured over six minutes for each substrate. Measurements occurred at either 12°C or 28°C, the temperature at which the fish had been acclimated. After 153 measurement, hearts were placed in a media bath of the next substrate while media was 154 155 exchanged in each chamber. Substrate metabolism was measured in the above order for each individual heart (Fig 1C). 156

157 Fatty acid saponification

Palmitic acid was conjugated to fatty acid-free bovine serum albumin (BSA) in order to 158 159 facilitate cellular uptake by the heart ventricles. A solution of 4 mM sodium palmitate and 150 mM NaCl was prepared and heated to 70°C until fully dissolved. A second solution of 0.68 mM 160 fatty-acid free BSA and 150 mM NaCl was prepared, sterile filtered, and warmed to 37 °C. Once 161 162 dissolved, equal parts hot palmitate solution was transferred in small increments to the BSA solution, while stirring. The final solution was stirred for 1 hour at 37°C and stored at -20°C until 163 164 use. Conjugation produces a final concentration of 2 mM palmitate: 0.34 mM BSA (6:1 FA:BSA), which is at a 2X concentration of the final working solution used in metabolic 165 measurements. 166

167 Statistical analysis

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Raw data processing and statistical analyses were conducted using RStudio 1.1.463.

169 **Results**

170	The HTMR is a simple custom design composed of a plexiglass water bath enclosing
171	micro-respiration chambers connected to a multi-channel oxygen meter (Fig 1A). For a 10-
172	chamber system, the approximate cost per chamber is \$1870, including the cost of the oxygen
173	meter and stir-plate. The full cost of the system is broken down in Table 1. The oxygen meter
174	itself represents the highest cost (~\$14,000 for ten inputs). followed by 1 ml glass chambers with
175	lid containing two injection ports (~\$300 each). Optical-fiber cables and sensor spots combined
176	are approximately \$95 each. A multi-place stir-plate is also necessary (~\$900).

177 Table 1. Cost breakdown of HTMR system

Description	Manufacturer	Product #	Cost
10-channel microfiber-optic	PreSens	30000008	\$13,966
oxygen meter			
O ₂ Sensor Spots	PreSens	200001526	\$26
Fiber optical cable	PreSens	200001731	\$69
Glass chamber	Unisense	MR-CH1	\$88
Glass chamber lid with two	Unisense	MR-CH INJECT	\$183
microinjection ports		LID	

178

179 Methodological validation

180 Net flux was tested at multiple oxygen concentrations. In the chambers, background
181 activity was negligible (2.038 pmol*s⁻¹), when flux was measured at 100% air saturation (Fig
182 2A). In contrast, the average oxygen consumption rate of *F. heteroclitus* ventricles with glucose

is 39.818 pmol*s⁻¹, thus flux at 100% air saturation is approximately 5%. Similarly, at 85% air
saturation (Fig 2B), flux was negligible (-0.324 pmol*s⁻¹), representing less than 1% of cardiac
glucose MO₂. In contrast, flux was somewhat high at 50% with an average flux -14.429 pmol*s⁻¹
¹, likely due to high leak (S1 Fig). However, for all three oxygen concentrations, flux was equal
among chambers by one-way ANOVA testing (p=0.696, p=0.643, p=0.733 at 100%, 85% and
50% air saturation, respectively).

Fig 2. Chamber reproducibility in flux and metabolism. Flux was measured at 100% (A), 85% (B) in all four chambers of the HTMR. Additionally, MO₂ of a standardized yeast cell suspension, was measured in each chamber (C). Oxygen consumption rates were calculated in pmol*s⁻¹ and are represented by the mean with standard error bars (n=3 for each measurement). A one-way ANOVA was used for each measurement to test that there were no differences among chambers.

To test biological repeatability among the chambers, yeast metabolism per chamber was 194 195 measured. Average MO₂ was 12.502 ± 1.907 pmol*s⁻¹, and there were no significant differences in metabolism between each of the chambers (ANOVA, p = 0.538; Fig 2C). This MO₂ for yeast 196 is approximately 40-fold higher than the net flux at 85% air saturation. In addition to yeast 197 measurements, heart ventricles were measured across all four chambers over a 45-minute time 198 199 period to validate both repeatability among chambers and that ventricles can maintain consistent 200 metabolic activity over time. Among the four replicates, there was no significant difference in 201 metabolic rate when regressed against time (linear model, p = 0.657; Fig 3A). Additionally, there 202 were no significant differences in metabolic activity among the four chambers for each heart (ANOVA, p = 0.363; Fig 3B).203

Fig 3. Cardiac glucose metabolism over time within the HTMR. *F. heteroclitus* ventricles (n=4) in Ringer's with glucose media were rotated through the chambers and measured at 28°C. (A) Linear regression of cardiac

206 glucose MO₂ for the four replicated time periods (p=0.657) (B) Average metabolic rate per chamber, 207 represented by the mean and standard error bars (ANOVA, p = 0.164).

208 Substrate specific utilization

Heart ventricles were measured at corresponding acclimation temperatures; thus, 209 temperature represents both the physiological effects of acclimation and the direct effect of 210 211 temperature on MO₂. All hearts were metabolically active under each of the four substrate 212 conditions (Fig 4). For substrate specific metabolism, data was analyzed separately for 213 individuals measured at 12°C or 28°C. There is a large inter-individual variation in substrate 214 specific metabolism, which reduces the statistical power to reject the null hypothesis of no 215 difference among substrates. To avoid this type II error, we apply paired t-tests that compare 216 substrates within each individual and use Bonferroni's test to correct for multiple tests [23]. 217 Glucose, FA, and LKA metabolism were significantly greater than endogenous (p=0.001, 218 Bonferroni's corrected p=0.006); except FA at 12°C (p=0.03; Bonferroni's corrected p=0.18; Fig 219 4A). Glucose metabolism was significantly greater than FA and LKA (Bonferroni's corrected 220 p=0.006) at both 12°C and 28°C. FA metabolism was significantly greater than LKA metabolism at 28°C (Bonferroni's corrected p=0.006; Fig 4B) but not at 12°C (p=0.5; Fig 4A). 221 222 Fig 4: Heart ventricle substrate specific metabolism. Substrate specific ventricle MO₂ as a percent of 223 glucose consumption, represented by the mean with standard error bars. Percent glucose metabolism is relative 224 to the mean glucose metabolism of all individuals measured at each temperature. Metabolism was measured at 225 12°C (A) and 28°C (B). A paired t-test was used to compare substrate metabolism within individuals, with 226 Bonferroni test correction. Letters indicate significance levels between each substrate. At 12°C, n = 95. At 227 28° C, n = 105.

The log_{10} substrate specific MO₂ from Maine and Massachusetts acclimated to 12°C and 28°C determined here can be compared to MO₂ measured in Oleksiak *et. al* (2005) for Maine individuals acclimated to 20°C using an ANCOVA with log_{10} body mass and temperature as linear covariates. There were no significant differences (p = 0.55, 0.15, and 0.85 for glucose, FA and LKA respectively) and the least squares fall within 5% of one another.

233 Allometric scaling of metabolism

234 Both body mass and heart ventricle mass were measured of each F. heteroclitus 235 individual measured at each temperature. The mean body mass of individuals measured at 12°C 236 and 28° C was 9.11 ± 2.87 g and 9.32 ± 2.90 g, respectively, and was not significantly different between temperatures. Additionally, average ventricle masses were 0.013 \pm 0.005 and 0.010 \pm 237 238 0.004 for 12°C and 28°C, respectively and did not significantly differ between acclimation temperatures. In F. heteroclitus body mass and heart mass are highly correlated (linear 239 240 regression at 12°C R²= 0.74, p<0.0001; for 28°C, R²= 0.66, p < 0.001) thus, body mass was used 241 to correct for variation due to mass between individuals, as done previously [24]. Body mass 242 explained a significant amount of the variation (30-70%) in metabolism among individuals for 243 all conditions (Fig 5). Variance explained by body mass (R²), was higher at 12°C than at 28°C (Fig 5, S1Table). For glucose MO₂, allometric scaling was identical (to the 2nd significant digit) 244 245 to previous determinations and nearly the same as in Jayasundara *et al.* (2015). Examining the 246 effect of temperature and substrates, allometric scaling coefficients (S1 Table), were between 0.65 to 1.29. While body mass contributed significantly to the variation between individuals, 247 248 there was no effect of sex on cardiac metabolism by linear regression at each substrate-249 temperature combination. A three-way ANOVA including substrate, body mass and sex showed

no significant differences between males and females in cardiac metabolism at 12° C or 28° C (p = 0.0963 and p= 0.4143, respectively).

Fig 5. Allometric scaling relationship of substrate specific metabolism. Regression of log MO₂ versus log body mass with each substrate. Top panels represent fish measured at 12°C while bottom panels represent 28°C. Hearts were measured as described in Fig 1 with glucose, fatty acids, LKA and endogenous metabolism. At 12°C, n= 105 and at 28°C n=95. For full data on regression slopes, see S1 Table.

256 **Discussion**

257 Design

258 The HTMR provides a simple custom design for measuring small biological samples that 259 allows higher throughput measurements at lower costs. While cost is still not negligible, the system as described here, including the oxygen meter, sensors, stir control and chambers reduced 260 cost by up to 30% compared to other manufacturers. The system costs approximately 10-fold 261 262 less than the Agilent Seahorse and does not suffer from expensive disposable chambers and 263 reagents. Using the 10 channel PreSens meter, combined with the custom chamber design, cost per chamber was approximately \$1870 which was 70% and 80% of the cost compared to 264 265 Unisense OPTO MicroOptode and Loligo OX11875 Witrox systems, respectively. The PreSens 266 oxygen meter was primarily chosen due to the flexibility of the 10-channel system. Similar 267 multi-channel systems such as the Strathkelvin Instrument use Clark electrodes, while PreSens 268 uses smaller, more precise optical oxygen sensors. Unlike Clark electrodes, the optical sensors 269 do not consume oxygen, are less expensive and have faster response times. Additionally, the 270 fiber optical cables, and oxygen meter can be used with other sensor designs for applications 271 such as whole animal metabolism [25]. This allows additional flexibility and is more

economical, as the instrument can be used for measuring both tissue-specific, whole animal
metabolism and numerous applications involved with oxygen measurement. Assuming a large
intended sample size, with four substrate measurements per heart, this instrumentation design
becomes more and more economical as you increase the number of chambers, making it useful
for large phenotypic analyses.

277 Certain limitations were encountered while developing the multi-chamber system that are 278 important to highlight. For the HTMR, several oxygen sensors were evaluated, but the sensor 279 spots were chosen for their ease of use and durability. They are long lasting and customizable in their placement, allowing for repeated use. Other sensors, such as profiling oxygen microsensor 280 281 probes were tested; however, they were more fragile and cumbersome to use. Temperature 282 control is also essential for consistent and repeatable measurements. Temperature has a large 283 impact on oxygen solubility; thus, precise temperature control is necessary and was closely 284 regulated and monitored during measurements.

285 Chamber mixing was another important factor to control. Without thorough mixing from 286 the stir-bars, oxygen measurements are inconsistent and inaccurate. This is an advantage of this 287 system design over other multi-well plate style oxygen readers in which the media is unstirred 288 during measurement, but instead rely on mixing prior to measurement. Continuous stirring 289 allows for longer measurement periods. The size of the mesh that holds the tissue above the stir 290 bar was also optimized: very small mesh inhibits mixing, but too large mesh would not separate 291 the tissue from the stir bar in the bottom of the chamber. Additionally, nylon mesh was used over 292 steel mesh, as it did not as readily retain air bubbles.

Finally, leak was tested extensively. At 85% air saturation, background flux (O_2 use not associated with biological sample) was small (< 1 pmol*s⁻¹) compared to heart ventricle and

yeast MO₂. To account for any amount of flux, blank measurements were taken throughout runs
and corrected for in each chamber, with no significant differences in leak among chambers.
Initially, the Unisense microinjection lids were chosen for flexibility; however, after completing
tests and measurements, the manufacturers released information that this particular model was
less airtight than other models. For future design construction, we recommend that researchers
use single-port lids with a sufficient path length to further minimize leak through diffusion.

301 Methodological Validation

302 The HTMR is sensitive to both substrates used to fuel heart ventricle metabolism and body 303 mass. HTMR determinations were very similar to previously published data (within 5%) [19]. 304 Additionally, substrate specific patterns, with highest rates supported by glucose, agree with previous measurements in *F. heteroclitus* [19]. Metabolism was unaffected by the time course 305 for measuring the four substrate conditions. Ventricles continue to contract over the duration of 306 307 the experiment and show no significant decline in metabolic activity (Fig 2A.). Importantly, body mass accounted for a significant amount of variation in these individuals following an 308 allometric scaling pattern, and the log mass against logMO₂ linear regression has nearly identical 309 slopes to those determined by others [15,19]. These data suggest that the system is both precise 310 because the variation among samples did not obscure substrate or body mass effects and accurate 311 312 in that substrate specific metabolic rates are similar to previous measures [19] and have allometric scaling coefficients very similar to published data [15]. 313

314 **Conclusions**

The HTMR was designed to measure metabolism in many individuals, because of the large individual variation and adaptive significance of the trait. We were specifically interested in

cardiac metabolism in F. heteroclitus, as this species shows large inter-individual variance in 317 318 cardiac metabolism and the mRNAs associated with this variance [19], and these patterns may 319 hold true for many species. To better understand the physiological and evolutionary importance 320 of this variance requires many individuals which the HTMR allows. For example, in this study, 321 metabolism was quantified in approximately 200 ventricles in only 10 days. Although here the 322 system is tested only with F. heteroclitus, this system could easily be extended to study other types of tissue-specific metabolism in many individuals. The decreased cost and efficiency of the 323 324 design can have countless applications, allowing for high-throughput measurement of tissue 325 metabolism that can enhance our understanding of the adaptive importance of these traits.

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404 Supporting information

- 405 **S1 Fig. Chamber reproducibility in flux at 50% air saturation.**
- 406 Flux was measured at 50% air saturation in all four chambers of the HTMR. Oxygen
- 407 consumption rates were calculated in pmol*s⁻¹ and are represented by the mean with standard
- 408 error bars (n=3 for each measurement). A one-way ANOVA was used to test variance between
- 409 chambers (p=0.733).

410 **S2 Fig. Chamber Leak over Time.**

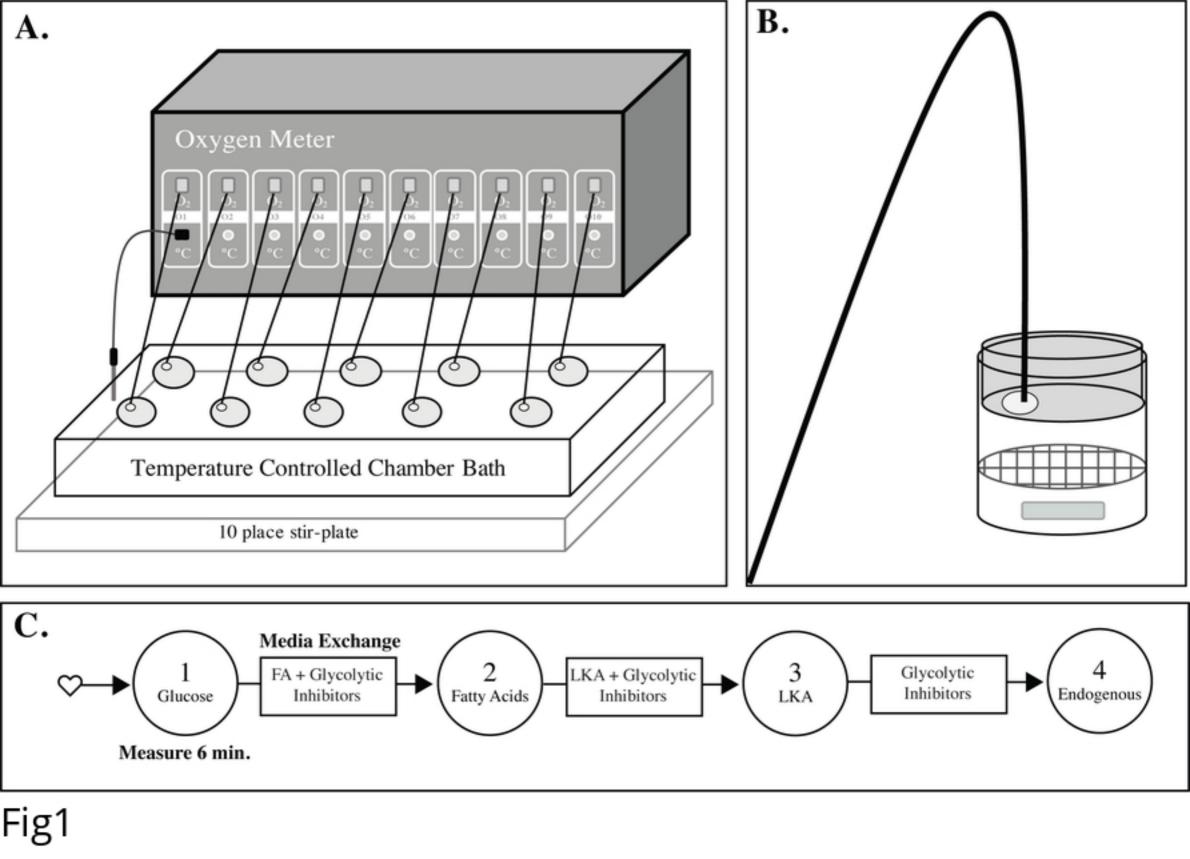
- 411 Leak was tested at both high (A) and low (B) oxygen concentrations. Note the y-axes are
- 412 different values but are incrementally scaled the same.

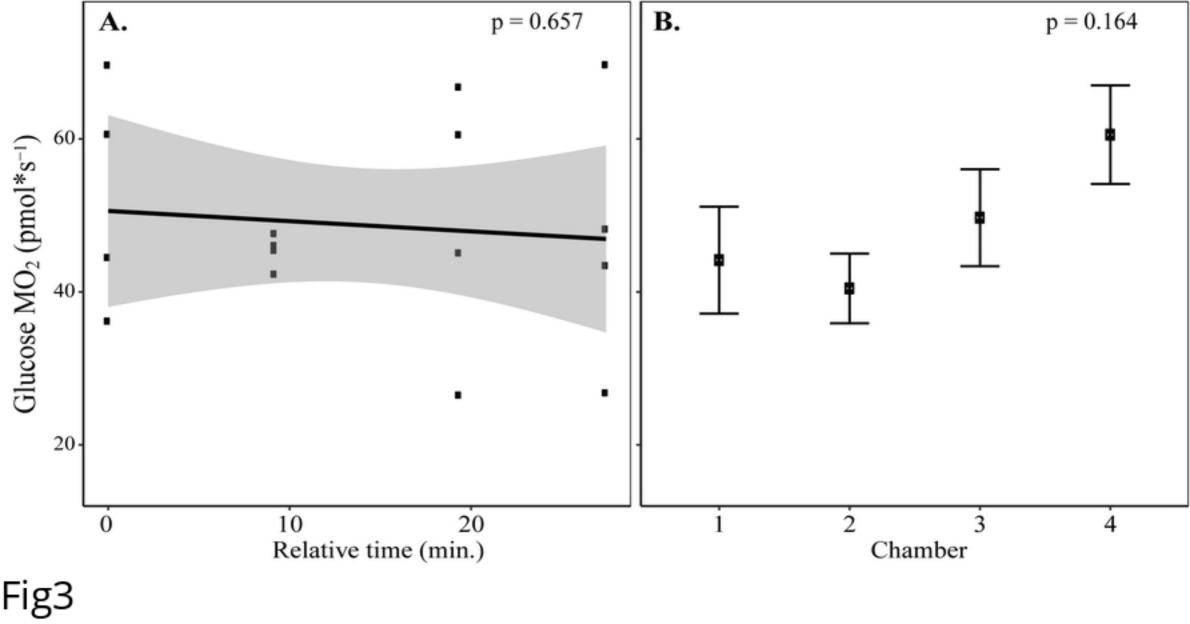
- 413 **S1 Table.** Descriptive statistics of body mass regression analysis. Slope and y-intercept data of
- the allometric relationship of body mass with substrate specific metabolism derived from a linear
- 415 model of the log of metabolic rate against the log of body mass per substrate by temperature.

	12°C				28°C			
	Glucose	FA	LKA	Endogenous	Glucose	FA	LKA	Endogenous
Slope (b)	0.7951	0.8698	0.7042	0.9339	0.6462	0.6702	1.2967	1.276
y-intercept (a)	0.7666	0.5374	0.7076	0.4484	0.9734	0.7955	-0.0004	-0.1046
\mathbb{R}^2	0.6882	0.4726	0.5478	0.7184	0.4876	0.4464	0.2995	0.4259
Ν	94	80	91	90	101	99	101	89
	p-value							
Slope (b)	5.19E-25	1.89E-12	5.17E-17	6.04E-26	4.78E-16	4.21E-14	1.42E-13	2.86E-08
y-intercept (a)	1.65E-25	7.13E-07	2.19E-18	3.00E-11	6.48E-28	6.69E-19	0.998	0.609
	Standard Error							
Slope (b)	0.0558	0.1041	0.0678	0.0623	0.0666	0.0758	0.1513	0.2092
y-intercept (a)	0.0528	0.0996	0.064	0.059	0.0634	0.0719	0.1452	0.2038
	95% Confidence Interval							
Slope (b)	0.6835 to 0.9067	0.6617 to 1.0779	0.5686 to 0.8399	0.8092 to 1.0585	0.5130 to 0.7793	0.5187 to 0.8218	0.9941 to 1.5993	0.8575 to 1.6944
y-intercept (a)	0.6610 to 0.8723	0.3382 to 0.7366	0.5796 to 0.8356	0.3304 to 0.5664	0.8465 to 1.1003	0.6518 to 0.9392	-0.2908 to 0.2901	-0.5123 to 0.3030
Significance Between Slopes*	Endogenous	NS	Endogenous	Glucose LKA	LKA Endogenous	LKA Endogenous	Glucose FA	Glucose FA

416 * Comparisons are within a single temperature between substrates based upon 95% confidence intervals presented

417 above.





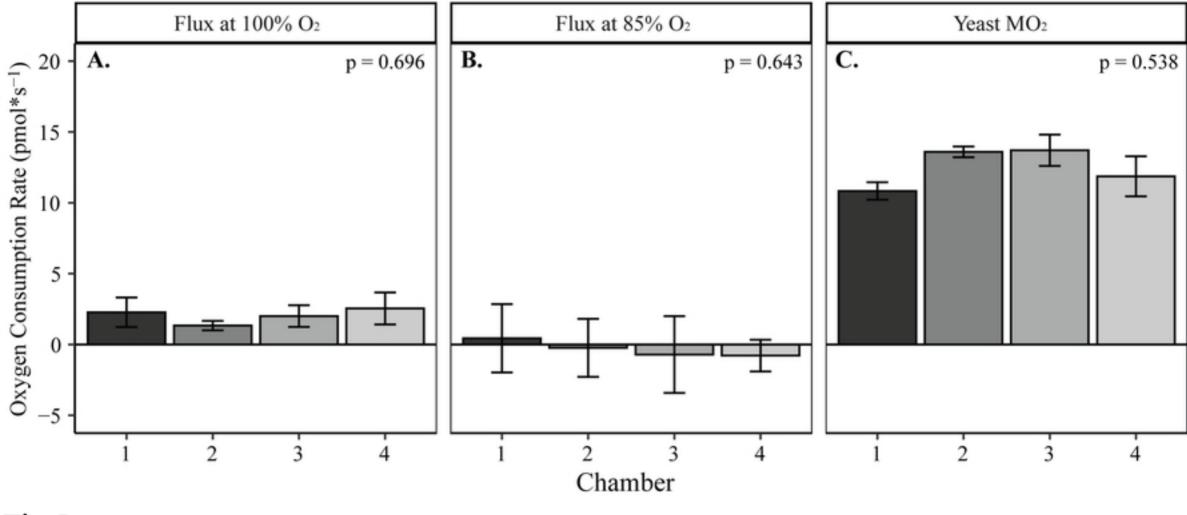
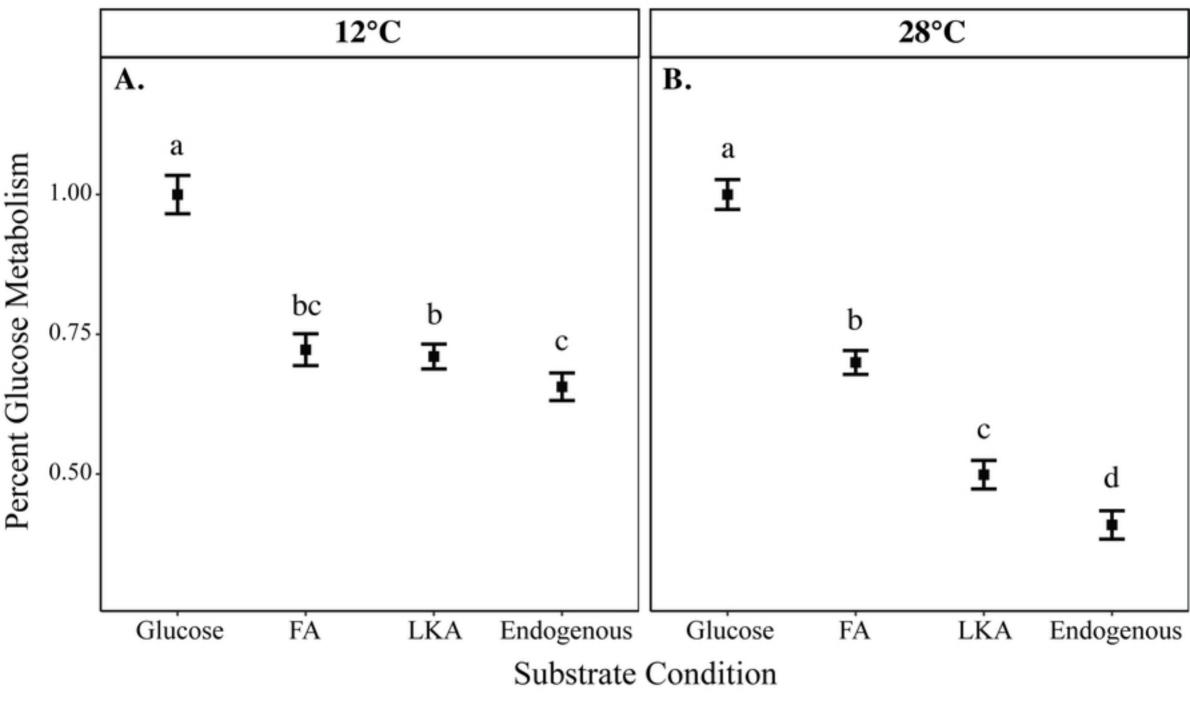


Fig2



Acclimation and Measurement Temperature

Fig4

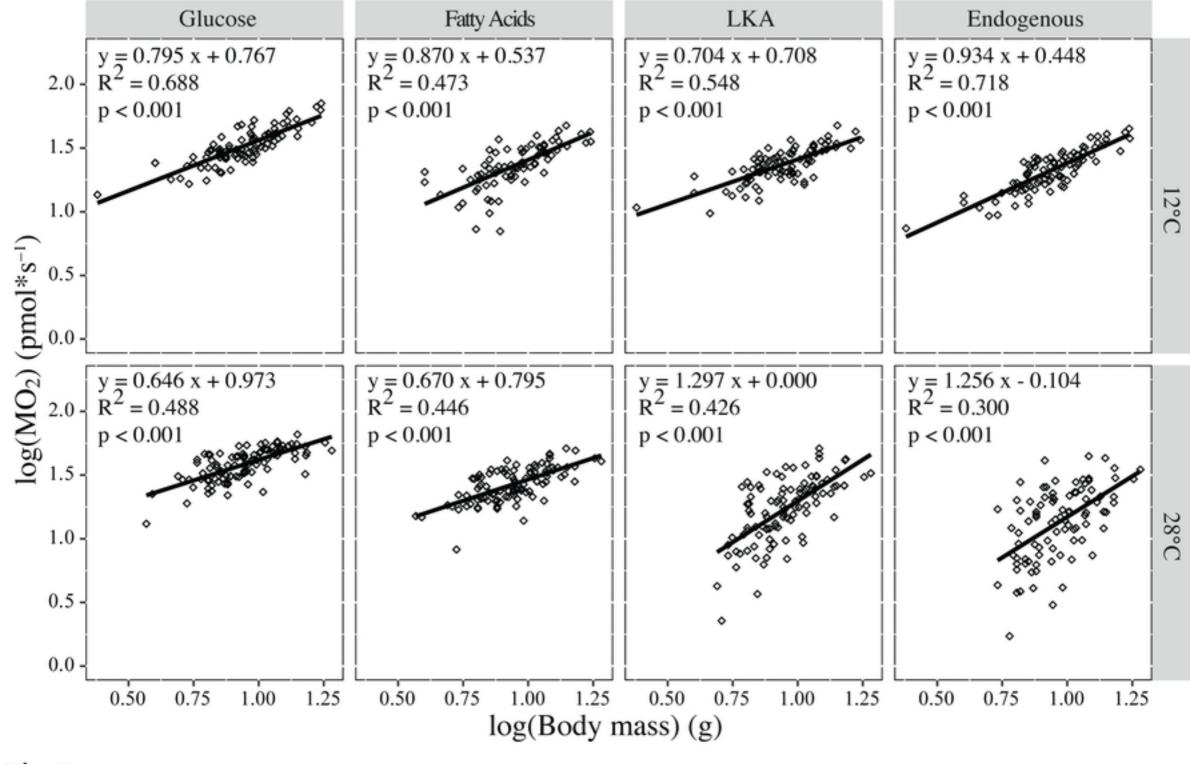
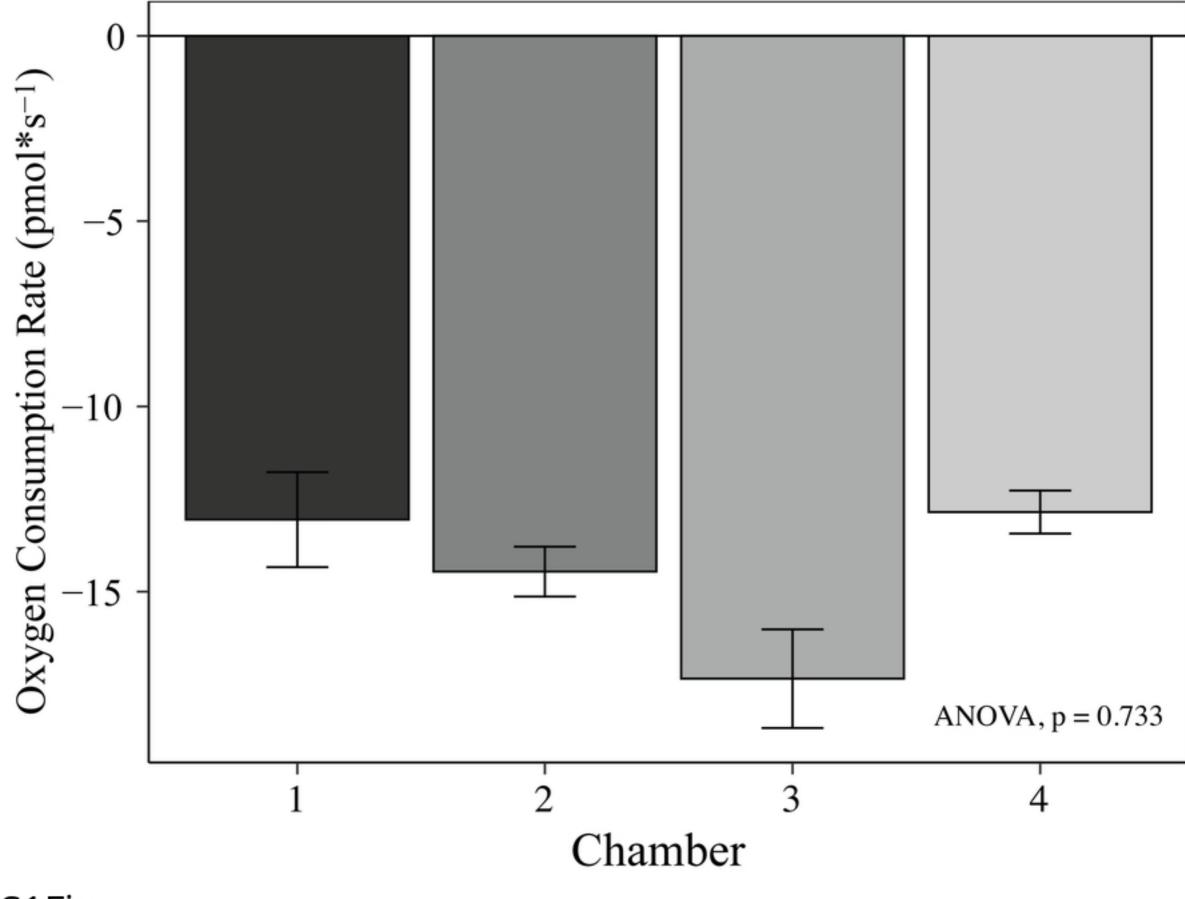


Fig5



S1Fig

