

Main Sequence of Human Luminance-evoked Pupil Dynamics

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Abstract

■ Pupil responses are commonly used to provide insight into visual perception, autonomic control, cognition, and various brain disorders. However, making inferences from pupil data can be complicated by nonlinearities in pupil dynamics and variability within and across individuals, which challenge the assumptions of linearity or group-level homogeneity required for common analysis methods. In this study, we evaluated luminance evoked pupil dynamics in young healthy adults (n = 10, M:F = 5:5, age 19–25 years) by identifying nonlinearities, variability, and conserved relationships across individuals to improve the ability to make inferences from pupil data. We found a nonlinear relationship between final pupil diameter and luminance, linearized by considering the logarithm of luminance. Peak diameter change and peak velocity were nonlinear functions of log-luminance for constriction but not dilation

responses. Across participants, curve fit parameters characterizing pupil responses as a function of luminance were highly variable, yet there was an across-participant linear correlation between overall pupil size and pupil gain (i.e., diameter change per unit log-luminance change). In terms of within-participant trial-by-trial variability, participants showed greater variability in final pupil size compared with constriction peak diameter change as a function of log-luminance. Despite the variability in stimulus—response metrics within and across participants, we found that all participants showed a highly stereotyped "main sequence" relationship between peak diameter change and peak velocity (independent of luminance). The main sequence relationship can be used to inform models of the neural control of pupil dynamics and as an empirical analysis tool to evaluate variability and abnormalities in pupil behavior.

INTRODUCTION

Pupil size is commonly measured to provide insight into visual perception, autonomic control, and cognition. Sensory information about visual luminance and defocus blur cause changes in pupil size and pupil size controls the amount of light entering the eye and the depth of field of the visual image (Barbur, 2003; Myers, Barez, Krenz, & Stark, 1990; Semmlow & Stark, 1973; Campbell & Green, 1965; Stark & Sherman, 1957). Clinical examination of pupil responses can be useful for differentiating and localizing neuropathology (Blumenfeld, 2010; Bremner, 2009; Kawasaki, 1999). Pupillography research has extensively catalogued correlations between pupil responses and cognitive phenomena including attention, arousal, memory, salience, and more (Strauch, Wang, Einhäuser, Van der Stigchel, & Naber, 2022; Joshi & Gold, 2020; Ebitz & Moore, 2019; Mathôt, 2018; Einhäuser, 2017; Wang & Munoz, 2015). Given the multitude of sensory and cognitive influences on pupil size, making inferences about neural activity from externally observable pupil behavior can be challenging.

Inferences between neural activity and pupil data can be further complicated by nonlinearities in pupil response dynamics. There are two commonly described nonlinearities involved in luminance evoked pupil dynamics. First, both pupil size and firing rates of luminance neurons in the pretectal olivary nucleus (macaques) depend on the logarithm of luminance (Clarke, Zhang, & Gamlin, 2003; Pong & Fuchs, 2000; Gamlin, Zhang, & Clarke, 1995; Ellis, 1981). Pupil size can be described by a linear or sigmoidal function of log-luminance, with the latter describing the saturation of pupil size at luminance extremes (Watson & Yellott, 2012). Second, pupillomotor responsiveness is nonlinearly modulated by instantaneous pupil size, where pupil size change per unit stimulus peaks at midrange pupil size. This effect can be observed from human behavior (Semmlow, Hansmann, & Stark, 1975), electrophysiological stimulation of the parasympathetic and sympathetic nerves in cats (Terdiman, Smith, & Stark, 1971), and pharmacological experiments in isolated iris smooth muscle from rabbits (Yamaji, Yoshitomi, Usui, & Ohnishi, 2003). Modeling studies have related this size-dependent nonlinearity to the biomechanics of the iris smooth muscles (Fan & Yao, 2011; Semmlow & Stark, 1971). These nonlinearities can lead to distorted inferences about the consequences of luminance variation on neural activity,

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or the relationship between changes in neural activity and observable pupil diameter. On the other hand, there is evidence of linearity in cognitive pupil size modulations (Reilly, Kelly, Kim, Jett, & Zuckerman, 2019), suggesting potential cognitive-level nonlinearities that compensate for downstream biomechanical nonlinearities. Thus, there is a need to better quantify nonlinearities in pupil behavior and to distinguish nonlinearities exclusive to a sensory modality (e.g., luminance) from motor system nonlinearities common to all pupil responses (including cognitive).

A final challenge when making inferences from pupil data is the limited characterization of variability in pupil responses within and across individuals. Withinparticipant variability includes changes in average stimulus-response relationships over time and momentby-moment changes in pupil size when environmental luminance and target distance are experimentally held constant (Stark, Campbell, & Atwood, 1958). Withinparticipant variability also interacts with the size-dependent nonlinearity previously described; that is, the magnitude of pupil variability depends on absolute pupil size (Stanten & Stark, 1966). Across-participant variability describes the differences between the average stimulus-response relationships between people. Previous studies have described the effects of age and light adaptation in explaining some variability of pupil responses (Watson & Yellott, 2012; Winn, Whitaker, Elliott, & Phillips, 1994). Furthermore, one study focusing on across-participant variability in the pupil light reflex (with transient light flashes) found a wide range of pupil response variability between participants and correlated variability in pupil diameter change and velocity independent of age or mean pupil size (Bremner, 2012). Thus, there is a need for better quantification of within- and across-participant variability, particularly among young healthy adults (i.e., independent of aging and pathology).

The purpose of this study is to evaluate luminance evoked pupil dynamics in young healthy adults with a focus on quantifying response nonlinearities, variability, and conserved relationships across participants. We analyzed pupil responses from humans viewing step changes in grayscale luminance on a computer screen. We found a nonlinear relationship between final pupil diameter and stimulus luminance, linearized by considering the logarithm of luminance. However, other metrics such as peak change in diameter and peak velocity are still best described through nonlinear functions of log-luminance for constriction but not dilation responses. We quantify across-participant variability through the variability between linear regression parameters, finding an acrossparticipant linear correlation between pupil gain and pupil size. Finally, despite the large degree of within-participant and across-participant variability in stimulus-response parameters (i.e., characterizing pupil response metrics as a function of the luminance stimulus), we describe a highly stereotyped main sequence relationship, that is, a conserved nonlinear relationship between peak change in diameter and peak velocity for all participants on a trial-by-trial basis. We introduce the use of the pupil main sequence analysis as a research tool to better understand nonlinearities and variability in the sensory–motor and cognitive control of pupil behavior.

METHODS

Participants

All experimental procedures were reviewed and approved by the Human Research Ethics Board of Queen's University (protocol ID: PHYS-007-97). Ten participants (M:F = 5:5) age 19–25 years (undergraduate and graduate students) were recruited for this study. All participants had normal or corrected-to-normal vision and provided written informed consent. Our sample size was based on resource constraints rather than a priori power analysis; however, we specifically set out to collect an equal sample size of male and female participants and to collect data from individual participants across two sessions on different days. In terms of number of participants, our sample size is small for estimating the true population distribution of pupil metrics. However, our goal is not to estimate population statistics but rather to provide a quantitative description about individual participant behavior. In addition, we analyze the variability of pupil metrics across participants with the goal of comparing relative variability in our sample population, that is, to infer which relationships are likely to be consistent or variable across participants rather than inferring the population distribution in pupil metrics.

Pupillography and Eye Tracking

Binocular pupil size and eye position were measured using an infrared, video-based eye tracker with a sampling rate of 500 Hz (Eyelink 1000, SR Research). Binocular pupil size measurements in video image pixels (proportional to pupil area) were scaled into millimeters diameter through a calibration procedure using false pupils of known size (Wang, Boehnke, Itti, & Munoz, 2014; Steiner & Barry, 2011).

Participants were seated comfortably in a darkroom with their heads restrained by a chinrest and headrest. Participants viewed a 17-in. LCD monitor with a resolution of 1280×1024 pixels and refresh rate of 60 Hz (Acer 1717). The monitor had a physical size of 33.9 cm \times 27.1 cm and was placed at a 60.0-cm viewing distance, resulting in a viewing angle of 32° horizontal by 25° vertical. The configuration of the experimental setup (i.e., headrest, monitor, eye tracker camera) was held constant for all participants. Each experimental session began with a 9-point eye position calibration task (targets eccentricity ranging from $\pm 14^{\circ}$ horizontal and $\pm 10^{\circ}$ vertical from center) to ensure accuracy of eye position measurements.

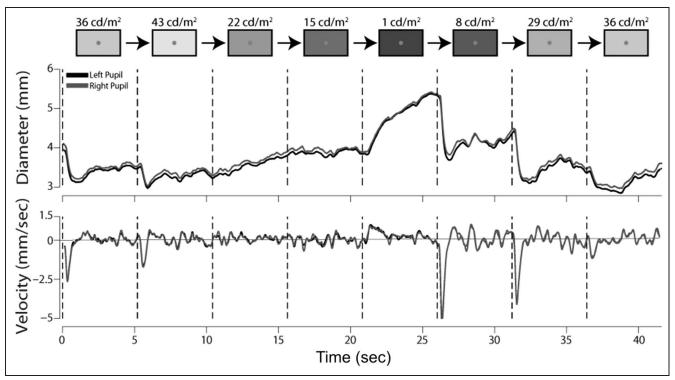


Figure 1. Example of a single trial. Participants centrally fixated a small dot $(0.5^{\circ}$ diameter, $18.5 \cdot \text{cd/m}^2$ luminance) while the background luminance stepped through a pseudorandom sequence of eight values (screen subtending $32^{\circ} \times 25^{\circ}$ viewing angle, luminance values ranging from 1 to 43 cd/m²). The timing of luminance transitions is illustrated in black dashed vertical lines, with each luminance value presented for 5.2 sec. Bilateral pupil diameter (mm) and pupil velocity (mm/sec) are plotted over time for a full trial (41.6 sec).

Behavioral Task

An experiment session had a duration of approximately 40 min total and consisted of 55 trials (a single trial is

illustrated in Figure 1). Each participant completed two sessions in total, with each session on separate days and differing only in the pseudorandomized sequence of luminance

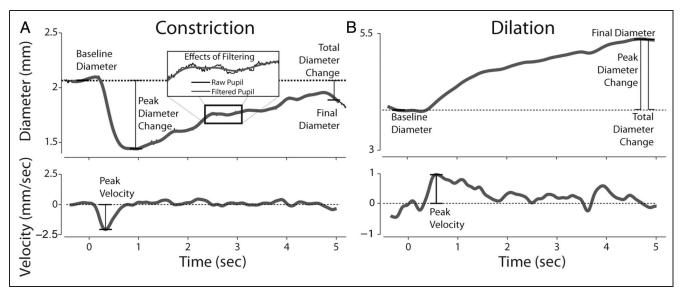


Figure 2. Examples of pupil response dynamics and metrics of interest during single luminance transitions. The luminance transitions occur at time = 0. The inset in A illustrates the effects of autoregressive filtering (10-Hz cutoff frequency) on diameter data to subsequently calculate velocity from the filtered traces. The dashed horizontal line traces baseline pupil diameter and zero velocity on their respective axes. Note the difference in *y*-axis scales between the constriction and dilation responses. (A) Example of a constriction response, illustrating unilateral pupil diameter and velocity over time and associated metrics of interest. (B) Example of a dilation response, illustrating pupil diameter and velocity over time and associated metrics of interest.

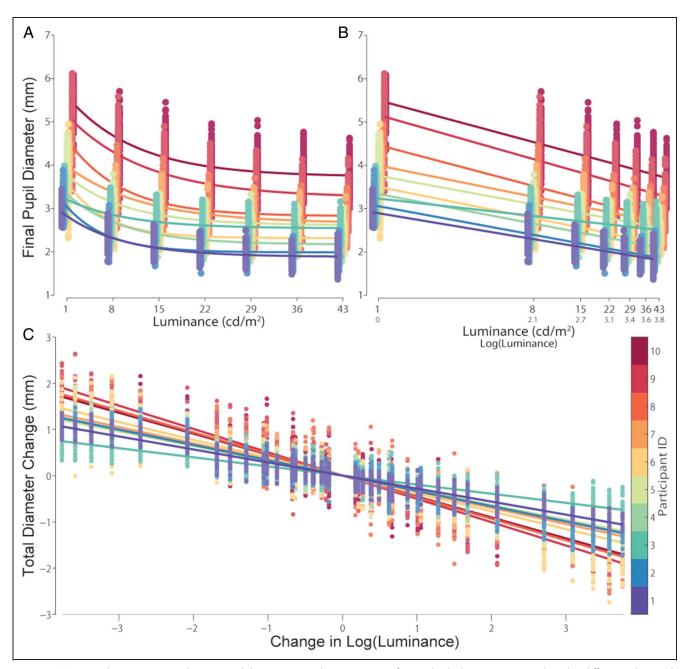


Figure 3. Transition-by-transition steady-state pupil diameter versus luminance. Data from individual participants are plotted in different colors, with colors sorted according to participants' average baseline pupil diameter in the darkest condition (1 cd/m²). Data for each participant have been horizontally offset in A and B for visual clarity. (A) Final pupil diameter (time averaged from the last 250 msec of each luminance stimulus) was nonlinearly correlated with stimulus luminance for each subject, fit with an exponential function $(y = a_1 \times \exp(-x/a_2) + a_3)$. (B) Final pupil diameter versus log-luminance, fit by a linear function $(y = a_1 \times x + a_2)$. (C) Total diameter change versus change in log-luminance, fit by linear proportionality $(y = a_1 \times x)$.

values presented in trials. The sequence of luminance values were pseudorandomized across the entire experiment to minimize the predictability of upcoming luminance values. Upon arriving at the laboratory for each session, participants confirmed their informed consent and were promptly seated in the darkroom to begin the calibration and experimental procedures within approximately 5–10 min (i.e., no enforced pre-experiment dark adaptation period; see Kelbsch et al., 2019). Participants were instructed to fixate the central dot and to minimize blinks

during the experimental trials but that they may move their eyes and blink freely during the intertrial interval (7-sec duration, 18.5-cd/m² luminance). The central fixation stimulus had a diameter of 0.5° visual angle and a luminance of 18.5 cd/m². We required central fixation to avoid potential measurement errors in pupil size due to eccentric eye position (Hayes & Petrov, 2016). Each trial consisted of a pseudorandomized sequence of eight gray-scale background luminance levels (ranging from 1 to 43 cd/m² in steps of 7 cd/m²). Each background luminance

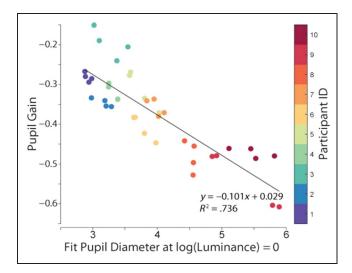


Figure 4. Across-participant variability in linear regression parameters characterizing the relationship between final pupil diameter and logluminance. Pupil gain, plotted on the y axis, describes the amount of total pupil diameter change per log-unit change in luminance (i.e., the slope of the linear regression between final pupil diameter and logluminance; Figure 3B). The x axis plots the fit value of pupil diameter when log(luminance) = 0 or when luminance equals 1 cd/m² (i.e., the y intercept of the linear regression of final pupil diameter vs. logluminance; Figure 3B). Thus, the values on the x axis reflect a prediction for pupil diameter based on all luminance values, whereas the order of Participant ID color is based on the mean final pupil diameter at log-luminance = 0 independent of pupil size at other luminance values. Each data point correspond to a single eye during a single session (i.e., four data points per participant from bilateral pupillography across two sessions). The black solid line represents the linear fit across all participants.

value was presented for 5.2 sec, resulting in trials of 41.6 sec. This long stimulus presentation duration was selected to accurately evaluate pupil dynamics considering the slow time course of dilation responses. Pupil responses to the onset of the first luminance value in a trial were not analyzed to avoid confounding from the intertrial interval.

Data Preprocessing

Our data consisted of time-series values of screen luminance (calibrated into cd/m^2), pupil size (calibrated into millimeters diameter), and eye position (calibrated into 2-D position in degree visual angle). These time-series data are recorded as trial segments corresponding to a pseudorandom sequence of eight luminance values held constant for 5.2 sec each (41.6 sec total per trial). Data were segmented into single transitions, with a total of (2 pupils) \times (7 transitions) \times (55 trials) \times (2 sessions) = 1540 transition segments per participant. Data were preprocessed to check for data loss (potentially corresponding to blinks) or deviation in eye position greater than 2°, resulting in the exclusion of 37% of the total 15,400 single transition time-series segments across participants. This conservative data inclusion strategy avoided the need for

model-based pupil size corrections (e.g., Kret & Sjak-Shie, 2019; Mathôt, Fabius, Van Heusden, & Van der Stigchel, 2018; Hayes & Petrov, 2016). To better estimate instantaneous changes in pupil diameter (i.e., pupil velocity), data were filtered using autoregressive filtering with a cutoff frequency of 10 Hz. Pupil velocity at each time step was calculated from the instantaneous differences in filtered pupil diameter.

Data Analysis

Figure 2 illustrates the pupil metrics extracted from individual luminance transitions. The "steady state" metrics included baseline pupil diameter (calculated from the 250-msec interval before luminance transition), final diameter (calculated from 4.90 to 5.15 sec after luminance onset, i.e., the final 250 msec of a presented luminance value), and total diameter change (i.e., difference between final and baseline pupil diameter). The "transient" pupil metrics included the value and timing of peak diameter change and peak velocity. The steady-state and transient metrics across individual luminance transitions for each participant were used to evaluate within-participant variability. In addition, we computed the average time series pupil response to each luminance transition condition (i.e., for each specific combination of initial and final luminance) for each participant, averaging together both sessions and both left and right pupils (see Appendix Table A1 for comparison of bilateral pupil size across sessions). Mean pupil metrics for each participant were then calculated from the mean time series, facilitating the comparison of across-participant variability.

The relationships between luminance values and pupil metrics (or covariation in pupil metrics) were analyzed through curve fitting. Linear fits were evaluated through linear regression. Nonlinear (exponential) fits were evaluated through iterative numerical optimization (i.e., MATLAB *fitnlm* function). Appropriateness of fit was evaluated through the statistical significance of terms in the fitted equations (determining if fits should be described as direct proportional, linear, or exponential). All data analyses were performed using MATLAB 2019b (MathWorks, Inc.). The data are available at https://osf.io/vrch6/, and all analysis code is available at https://github.com/blohmlab/PupilMainSequence.

RESULTS

The purpose of this experiment was to quantify luminance evoked pupil responses in humans. An example of a single trial is illustrated in Figure 1, where bilateral pupil size is measured during step changes in large-field grayscale luminance. We analyzed the metrics characterizing steady-state pupil behavior (i.e., baseline pupil diameter, final pupil diameter, and total diameter change) and metrics characterizing the transient dynamics of pupil

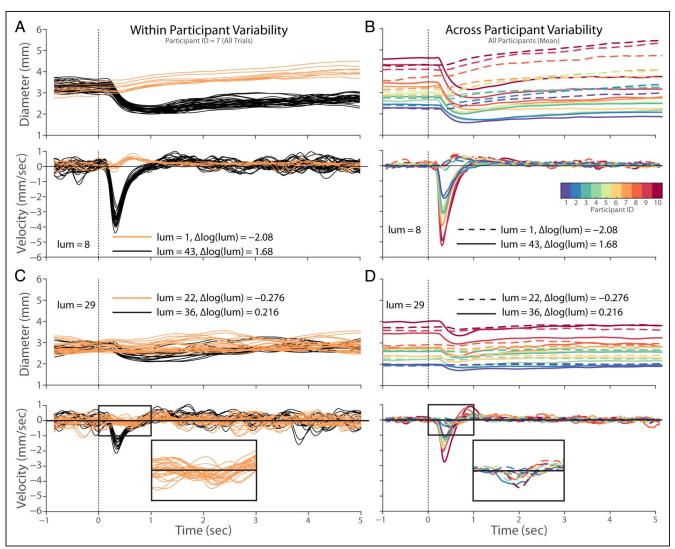


Figure 5. Within-participant variability in single transition pupil dynamics (A, C) and across-participant variability in mean pupil dynamics (B, D). Each row depicts luminance transitions beginning with the same value then increasing or decreasing in similar magnitude log-luminance steps. (A) Single-trial examples illustrating pupil diameter and velocity over time during large-magnitude luminance increase (from 8 cd/m² to 43 cd/m², 1.68 log-units and from 8 cd/m² to 1 cd/m², -2.08 log-units). (B) Mean pupil diameter and velocity over time for the same luminance transition conditions for each participant. (C) Single-trial examples, illustrating pupil diameter and velocity over time during a small change in log-luminance (from 29 cd/m² to 22 cd/m², -0.276 log-units and from 29 cd/m² to 36 cd/m², 0.216 log-units). (D) Mean pupil diameter and velocity over time for the same small-magnitude luminance changes for each participant. The inset in C and D illustrates pupil velocity from 0 to 1 sec in the decreasing luminance condition at $2\times$ magnification in both x scale and y scale, highlighting the negative velocity associated with the paradoxical constriction response.

responses (i.e., peak diameter change and peak velocity). These behavioral metrics are illustrated in Figure 2.

For each participant, final pupil diameter decreased with increasing luminance (Figure 3). The relationship between luminance and pupil diameter was nonlinear and was characterized by an exponential curve-fit (Figure 3A). When considering the luminance stimulus magnitudes on a logarithmic scale, the relationship was linear (Figure 3B). This logarithmic relationship suggests that the pupil responds to the ratio of luminance change rather than the absolute change in luminance, further demonstrated by the linear relationship between changes in pupil diameter and changes in log-luminance (Figure 3C). Thus steady-state pupil size for each individual participant was well characterized by a linear

relationship between pupil diameter and log-luminance, yet there was a large degree of within-participant trial-by-trial variability in final pupil diameter and across-participant variability in the parameters of this linear relationship.

The variability across participants in the relationship between pupil diameter and log-luminance can be numerically characterized through comparison of each subject's linear curve-fit parameters. Specifically, this characterizes two parameters corresponding to the slope (pupil gain) and offset (fit diameter at log-luminance = 0) for individual participants. Figure 4 illustrates the linear correlation between these parameters across participants, demonstrating that participants with larger pupils also show larger pupil gain (i.e., larger changes in pupil diameter

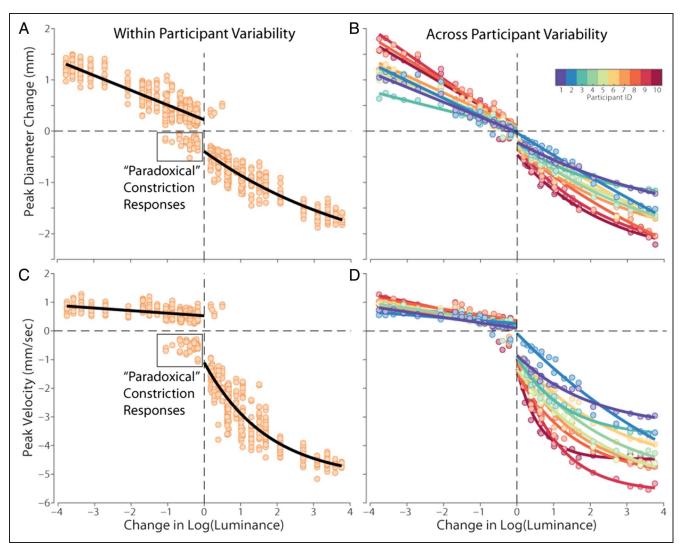


Figure 6. Transient pupil metrics: peak diameter change and peak velocity versus change in log-luminance. For each participant, dilation responses were fitted with a linear function ($y = a_1 \times x + a_2$) and constriction responses with an exponential function ($y = a_1 \times \exp(x/a_2) + a_3$). (A) Transition-by-transition peak diameter change versus change in log-luminance from a single participant, highlighting within-participant variability. (B) Peak diameter versus change in log-luminance for average pupil dynamics for each (initial, final) luminance condition for all participants, highlighting across-participant variability. (C) Transition-by-transition peak velocity versus change in log-luminance for average pupil dynamics for each (initial, final) luminance condition across participants.

per log-unit change in luminance). This finding should be contrasted with previous descriptions of within-subject pupil-size-dependent gain nonlinearity (e.g., Semmlow et al., 1975), which has been related to instantaneous pupil size and muscle-level nonlinearities. Instead, here, we describe across-participant variability in average pupil gain as a function of average pupil diameter.

Considering the transient dynamics of pupil responses, there were clear qualitative differences between the time-course of constriction versus dilation responses. Figure 5 illustrates constriction and dilation dynamics to large and small magnitude log-luminance changes. Figure 5A illustrates pupil responses for a single subject with an initial luminance value of 8 cd/m² switching to either 43 cd/m² (black lines) or 1 cd/m² (orange lines, matching their Participant ID color). These examples illustrate constriction and dilation responses (respectively) to large magnitude

changes in log-luminance. Note that constriction responses display larger magnitude peak velocity and earlier peak velocity times. Consequently, constriction responses also show large peak diameter changes early after the transition, overshooting their final values, whereas dilation responses continue to slowly dilate throughout. Figure 5B plots the mean pupil response for the same conditions across all participants, showing similar trends for each participant.

Figure 5C illustrates pupil responses for a single participant during small magnitude changes in log-luminance, showing different qualitative features. Notably, during small decreases in luminance, we observe occurrences of initial pupil constriction (Figure 6C inset). This paradoxical constriction response has a different magnitude and timing compared with constriction responses to small increases in luminance: It was more similar in timing to

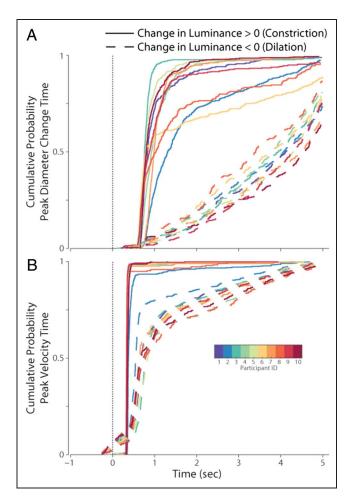


Figure 7. Cumulative probability distributions describing the timing of peak diameter change and peak velocity across participants. (A) Cumulative probability describing the timing of peak diameter change for trials with increasing luminance (solid lines) or decreasing luminance (dashed lines). (B) Cumulative probability distribution describing the timing of peak velocity for trials with increasing luminance (solid) or decreasing luminance (dashed).

the positive dilation velocity observed in large magnitude luminance decreases (Figure 5A). Figure 5D illustrates the averaged pupil response for each participant to the same small magnitude log-luminance transitions, again showing qualitatively similar across-participant responses. Thus, the transient dynamics of pupil responses show clear asymmetries between constriction and dilation and seem to nonlinearly depend on the magnitude of log-luminance change.

We quantified the transient dynamics of pupil responses through the peak diameter change and peak velocity metrics. Figure 6 illustrates peak diameter change as a function of change in log-luminance. For decreases in log-luminance, pupil peak diameter changes generally followed a linear trend except for small magnitude log-luminance changes, where instead the initial paradoxical constriction often produced larger diameter changes than subsequent dilation. For increases in log-luminance, we observed a nonlinear relationship, reasonably fit with an

exponential decay function characterizing a large initial value followed by saturation. The same trends were observed when considering peak velocity, illustrated in Figure 6C and D. For small decreases in log-luminance, we observed many occurrences of greater initial constriction velocity than subsequent dilation peak velocity. Generally, dilation peak velocity was much lower than constriction peak velocity. Thus, even after considering luminance on a logarithmic scale, constriction peak diameter change and peak velocity involve further nonlinearities.

The timing of transient response metrics is illustrated in Figure 7, grouping trials with increasing versus decreasing luminance. We observed similar trends in transient response timing across all participants. When luminance increases, the timing of peak diameter changes (Figure 7A) typically occurs between 0.5 and 1.5 sec after an increasing step in luminance. On the other hand, the timing of peak diameter change after decreasing luminance steps was highly variable, with a large proportion of responses showing continued dilation 5 sec after the luminance transition. The timing of peak velocity (Figure 7B) was highly regular for trials with increasing luminance, between 0.25 and 0.5 sec. Trials with decreasing luminance showed much more variability in peak velocity timing between 0.5 and 1.0 sec. Recall that dilation velocities are much lower than constriction velocities and the common occurrence of oscillations in pupil responses (Figure 5A and C), leading to a spread of identified dilation peak velocity times over the time course of the trial. Thus, constriction transient response metrics are much more time-locked to the luminance transition and identifiable than dilation.

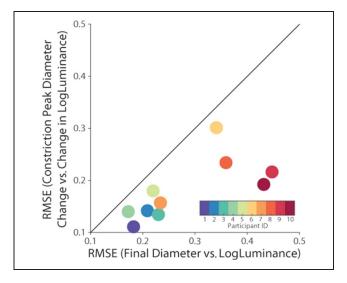


Figure 8. Within participant trial-by-trial variability in pupil metrics. The root-mean-squared errors of curve fits describing pupil metrics as a function of log-luminance are plotted for each participant. The unity line is illustrated in solid black. For each participant, variability in final pupil diameter (mm) as a function of log-luminance is consistently larger than variability in peak diameter change (mm) as a function of change in log-luminance in constriction trials (i.e., with dynamic overshoot).

To further evaluate within-participant trial-by-trial variability, we compared the variability in final pupil diameter with the variability in constriction peak diameter change (Figure 8). We specifically consider constriction peak diameter change because of the timing regularity relative to the luminance transition, whereas final pupil diameter may include additional sources of variability accumulating over time. For all participants, we found greater trial-by-trial variability in the final diameter compared with the constriction peak diameter change. Thus, we observe more within-participant variability in the final pupil size compared with transient constriction dynamics, suggestive of accumulated variability from uncontrolled parameters (i.e., unrelated to luminance).

We evaluated the covariability in transient dynamics for each participant. Figure 9 illustrates the relationship

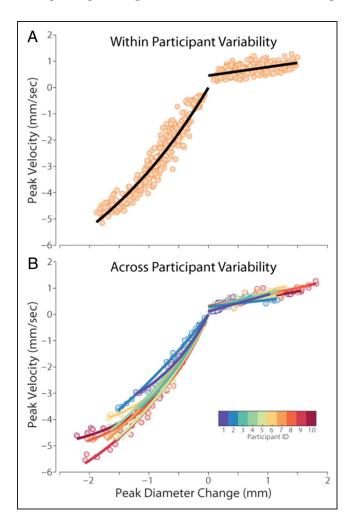


Figure 9. Human pupil main sequence: peak velocity versus peak change in pupil diameter. Dilation responses were well characterized by a linear function ($y = a_1 \times x + a_2$), except for small values where data tend toward 0 instead of a_2 . Exclusion of y-intercept parameter leads to unrealistic slope estimates. Constriction responses were better characterized by an exponential decay function, $y = a_1 \times (\exp(x/a_2) - 1)$, capturing the saturation of peak velocity in large constriction responses. (A) Trial-by-trial peak velocity versus peak diameter change for a single participant. (B) Average peak velocity versus peak diameter change for each (initial, final) luminance condition for each participant.

between peak velocity and peak diameter change. We observed qualitatively different trends for constriction versus dilation responses, but no longer observed the dramatic variability between participants apparent when considering the transient dynamics metrics as a function of the stimulus. We describe this highly stereotyped relationship across participants as the "Main Sequence."

DISCUSSION

The purpose of this study was to evaluate the dynamics of luminance evoked pupil responses in humans. We recorded participants' pupil size during step changes in grayscale luminance during visual fixation. We observed that pupil diameter was linearly correlated with the logarithm of the luminance of the visual stimulus. Furthermore, we found correlated variability between pupil gain and pupil size across participants. We found high acrossparticipant variability when considering transient dynamics metrics as a function of stimulus luminance, but a highly stereotyped "main sequence" relationship between peak velocity and peak diameter change across all participants. We first consider the limitations of the study and then discuss nonlinearities, variability, and pupil main sequence. Finally, we consider the importance of these observations for the field moving forward.

Limitations

First, our experimental setup was designed to be representative of typical research laboratory environments and therefore limited in the range of luminance values and the size of visual stimuli compared with natural conditions. As a result, pupil behavior at the physiological extremes (both small and large pupil sizes) may not be captured in our data. Although this limits the generalizability of our findings across environmental conditions, we believe this study is useful in characterizing pupil dynamics in the typical laboratory environments that pupillography will likely be employed in for research or clinical purposes.

Second, the behavioral task itself is quite unnatural (i.e., prolonged periods of visual fixation while viewing grayscale luminance changes while seated in a head and chin rest). In natural human environments, visual luminance typically varies across the visual field and over time and humans make eye movements (~3 saccades/sec), which will change the retinal input over time. Furthermore, we did not consider or control for the light-adaptation state of our participants, whose long term (>1 hr) luminance history was unknown. Finally, our task used monochrome grayscale luminance, whereas the real world contains chromatic light that may differentially impact pupil responses (Barbur, 2003; Gamlin, Zhang, Harlow, & Barbur, 1998). Thus, our study does not assess withinparticipant variability due to light adaptation, the contribution of spatial and chromatic luminance variation to pupil responses, nor potential interactions between pupil responses and eye movements.

Third, the participants in our experiment were not representative of the full diversity of humans, nor did our experiment explore the full diversity of within-participant variability. Nevertheless, this demographic is a valuable starting point for future research systematically testing the influence of age and clinical pathology on pupil dynamics. This group may be a typical "control" group, yet variability of pupil responses in young, healthy groups is underappreciated in literature. Thus, further research is required to systematically evaluate the regularity of the main sequence relationship and deviations from the main sequence.

General Discussion

We have quantified several nonlinearities in pupil response metrics. First, steady-state pupil diameter is a nonlinear function of luminance. This relationship can be linearized by considering the logarithm of luminance; that is, changes in steady-state pupil diameter depend on the ratio of luminance change (Watson & Yellott, 2012; Clarke et al., 2003; Pong & Fuchs, 2000; Gamlin et al., 1995; Ellis, 1981). This relationship should be accounted for when performing an analysis that assumes/requires linearity in stimulus–response relationships (e.g., by first logtransforming stimulus luminance). Second, peak diameter change and peak velocity are still nonlinear functions of log-luminance for constriction (Bremner, 2012; Ellis, 1981) but not dilation. Similarly, the constriction side of the pupil main sequence shows a nonlinear relationship. Thus, the nonlinear relationships in these metrics should be considered to avoid inappropriate curve-fitting or statistical analysis methods that would lead to biased inferences.

Our data demonstrate a high degree of acrossparticipant variability among young, healthy adults. The across-participant variability can be seen in all stimulusresponse relationships. However, we found correlated variability between overall pupil size and pupil gain across participants. Thus, participants with overall larger pupils also showed larger diameter changes per unit logluminance change. This type of across-participant variability cautions the use of baseline normalization (see also Mathôt & Vilotijević, 2023; Mathôt et al., 2018, for other cautions about normalizing pupil data). For example, if average pupil diameter varies between groups, the relationship between pupil size and pupil gain provides the a priori expectation that the group with the larger pupils will also show larger responses. A potential strategy could be to control for average pupil size during participant selection (e.g., finding pupil-size-matched controls). Another potential strategy could be to normalize each participant's pupil responses by their specific pupil gain before making inferences about stimulus strength or

effect size (for evaluating differences in pupil responses due to some intervention).

We also observed within-participant variability, described in terms of trial-by-trial variability in pupil response metrics. Specifically, we observed greater variability in final pupil size compared with transient constriction peak amplitude. The timing of the transient constriction responses is relatively early and time-locked to the luminance, which suggests an accumulation of variability from the time of constriction peak amplitude until the time of final diameter calculation. The sources of trial-by-trial variability remain beyond the scope of this study and merit further investigation.

Despite the variability described above, we found a wellconserved pupil main sequence: a nonlinear lawful relationship between peak velocity and peak diameter change for trial-by-trial luminance evoked pupil responses across all participants. The pupil main sequence does not consider the sensory inputs (i.e., the ongoing luminance values/changes) that produce trial-by-trial pupil responses, instead describing covariability in motor parameters of the transient pupil response. This analysis of motor covariability complements typical stimulusresponse style pupil analyses and our previous discussion of across-participant variability in terms of stimulusresponse parameters, for example, across-participant variability in pupil gain. Similar to the saccade main sequence (Bahill, Clark, & Stark, 1975), the structured covariability observed in the pupil main sequence could be informative for modeling the pupil control system. This relationship seems compatible with a pulse-step controller (Usui & Hirata, 1995; Robinson, 1973; Semmlow & Stark, 1971), particularly for constriction responses where large saturating peak velocities are observed. This hypothesis is compatible with neuronal responses in the primate pupillomotor control pathway, including the burst-tonic activity of intrinsically photosensitive retinal ganglion cells (Dacey et al., 2005) and pretectal olivary neurons (Pong & Fuchs, 2000). On the other hand, the asymmetries between constriction and dilation dynamics suggest potential differences in their underlying control (Longtin & Milton, 1989; Semmlow & Stark, 1971). Continued research is required to synthesize a model of pupil control that can account for the main sequence, and better models of sensory-motor pupil control can provide a foundation for further investigating the cognitive control of pupil size or making inferences about cognitive processes from pupil data.

The main sequence relationship can also be used in future research investigating abnormalities or variability in pupil behavior by further evaluating the regularity of the main sequence and the conditions resulting in deviations from this stereotypical motor covariability. For example, pupil responses during accommodation seem to show similar covariability between peak velocity and peak amplitude change, including the differences between constriction and dilation (Kasthurirangan & Glasser, 2005),

although the relationships and interactions between pupil responses to light, accommodation, and vergence merits further investigation. On the other hand, it is not clear if the main sequence motor covariability persists for cognitive-related pupil behaviors. For example, cognitive modulations of the pupillary light response (Wang, Huang, Yep, & Munoz, 2018; Binda & Murray, 2015; Ebitz & Platt, 2015; Mathôt, van der Linden, Grainger, & Vitu, 2013; Steinhauer, Condray, & Kasparek, 2000) may induce variability along the main sequence through changes in pupil gain or induce variability orthogonal to the main sequence through changes in motor programming—similar to the relationship between subjective value and variability in saccade peak velocity orthogonal to the saccade main sequence (Reppert, Lempert, Glimcher, & Shadmehr, 2015). Thus, the main sequence could be used as a research tool to investigate pupil behavior and the neural control of pupil dynamics.

Conclusions

We evaluated luminance evoked pupil dynamics in young healthy adult humans. We describe nonlinearities in pupil response metrics, variability within and across participants, and the stereotyped pupil main sequence relationship describing motor covariability in pupil dynamics. Our study highlights the need for more research to evaluate within- and across-participant variability and their sources. The main sequence should provide new avenues for investigating and modeling pupil variability and the neural control of pupil dynamics, including investigating the effects of light adaptation, cognitive phenomena, aging, the occurrence and progression of neurological disorders, and pharmacological interventions.

APPENDIX

We compared the diameter of left and right pupils for each participant and session, which is presented in Table A1. When considering a linear model with a bias term, most participants had near-unity slope and a bias within the range of physiological anisocoria (<0.4 mm, not considered a clinical concern; Steck, Kong, McCray, Quan, & Davey, 2018; Wang, Tworzyanski, Huang, & Munoz, 2018).

Table A1. Bilateral Pupil Response Linear Regression Results

Subj #	Session #	$Right\ Pupil = A \times Left\ Pupil + B$					
		A 0.993	Confidence Interval		B (mm)	Confidence Interval (mm)	
			0.986	1.000	0.117	0.092	0.142
1	2	0.953	0.941	0.965	0.090	0.041	0.138
2	1	1.001	0.986	1.017	0.269	0.202	0.336
2	2	1.039	1.023	1.055	0.216	0.155	0.277
3	1	0.919	0.903	0.935	0.340	0.291	0.390
3	2	0.950	0.937	0.963	0.090	0.048	0.132
4	1	0.715	0.691	0.740	0.471	0.397	0.545
4	2	0.795	0.777	0.814	0.420	0.369	0.470
5	1	0.903	0.893	0.913	0.146	0.119	0.174
5	2	0.960	0.948	0.971	0.105	0.075	0.136
6	1	0.961	0.946	0.976	0.049	0.006	0.091
6	2	0.898	0.886	0.910	0.170	0.134	0.206
7	1	1.087	1.065	1.108	-0.158	-0.210	-0.106
7	2	1.026	1.005	1.046	-0.054	-0.105	-0.003
8	1	0.907	0.896	0.917	0.239	0.205	0.273
8	2	0.915	0.902	0.927	0.180	0.143	0.217
9	1	1.003	0.992	1.014	0.013	-0.011	0.037
9	2	1.049	1.037	1.060	-0.039	-0.064	-0.014
10	1	1.053	1.038	1.068	-0.060	-0.095	-0.026
10	2	1.041	1.014	1.068	0.078	0.023	0.134

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Diversity in Citation Practices

Retrospective analysis of the citations in every article published in this journal from 2010 to 2021 reveals a persistent pattern of gender imbalance: Although the proportions of authorship teams (categorized by estimated gender identification of first author/last author) publishing in the *Journal of Cognitive Neuroscience* (*JoCN*) during this period were M(an)/M = .407, W(oman)/M = .32, M/W = .115, and W/W = .159, the comparable proportions for the articles that these authorship teams cited were M/M = .549, W/M = .257, M/W = .109, and W/W = .085 (Postle and Fulvio, *JoCN*, 34:1, pp. 1–3). Consequently, *JoCN* encourages all authors to consider gender balance explicitly when selecting which articles to cite and gives them the opportunity to report their article's gender citation balance.

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