Rapid withdrawal from threatening animals is movement-specific and mediated by reflex-like neural processing

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Abstract
Snakes and spiders are prototypical threat-stimuli that may trigger automatic avoidance reactions. Using a naturalistic paradigm, we show that humans withdraw their arm from photos of snakes and spiders faster, and with higher acceleration when compared to bird and butterfly stimuli. This was specific to withdrawal: approach, or button-press/release tasks failed to detect a similar difference. Using electroencephalography (EEG), we show that the fast withdrawal was mediated by two attentional processes. First, fast withdrawal responses correlated with early amplification of sensory signals (P1, 70-110 ms after stimulus). Second, a later correlate of feature-based attention (early posterior negativity, EPN, 200-240 ms after stimulus) revealed the opposite pattern: Stronger EPN was associated with slower behavioral responses, suggesting that the deployment of attention towards threatening stimulus features was detrimental for withdrawal speed. The results suggest that fast withdrawal is based on reflex-like attentional processing, and needs to be measured using a naturalistic paradigm.

Introduction

According to a widely-held view, humans are equipped with neural mechanisms that enable them to automatically detect, and consequently reflexively avoid potentially dangerous stimuli (henceforth, "threat-relevant stimuli") [1–3]. Snakes have been proposed as prototypical threat-relevant stimuli that humans typically avoid (and fear) due to automatically activated neural circuits. However, despite the common anecdotal narrative that humans reflexively avoid snakes when they encounter them in the wild, scientific evidence for the claim that snakes trigger automatic avoidance behaviors is lacking. Here, we show that threat-relevant animals (snakes and spiders) specifically trigger rapid withdrawal responses, but not other types of behaviors (such as approach behavior, or button press response), and that the speed of the withdrawal response is related in opposite ways well-known electrophysiological correlates of attentional selection that precede the behavioral response. This suggests that rapid withdrawal from threats consists of early amplification of sensory information, and inhibition of later deployment of attention to the stimulus features.

Snake detection theory states that primates evolved an automatic capacity to detect snakes because snakes were the main predators of early primates [4]. This phylogenetic adaptation is assumed to also be present in humans: a primitive neural pathway that relays information from the retina to amygdala via pulvinar is assumed to signal the presence of threats, and activate behavioral responses to the threat [1–3]. Research on monkeys shows that the pulvinar responds rapidly and strongly to pictures of snakes [5,6]. Other studies suggest that threat detection also

depends on cortical areas that help focus attention on the stimuli, and determine the behavioral relevance of the perceived stimulus [7,8].

In humans, event-related potentials (ERP) have been widely employed to characterize the time-course of activation that leads to the detection of threat. The P1 ERP wave is sensitive to unpleasant valence images, suggesting that potentially threatening objects receive priority early on in visual processing [9–11]. The established neural correlate of snake detection in humans is the Early Posterior Negativity (EPN) [12–14]. According to the prevailing interpretation, the EPN reflects the deployment of feature-based selective attention towards the potentially threatening visual object, which guides relevant behavioral responses to the threat [7,15,16].

The snake detection theory has also gained support from behavioral studies. For instance, primates (humans including) innately develop fear towards snakes, and consistent with the electrophysiological evidence, tend to automatically focus their attention towards them [17–19]. The attention-grabbing nature of threats has been demonstrated, for example, using search and dot-probe paradigms, but the studies have methodological problems, and the results of the studies have been mixed [20,21]. Compared to previous paradigms such as the dot-probe task and search tasks, we here ask the simpler question: Are participants' direct motor responses to threat-relevant animals are quicker when compared to non-treat-relevant animals. If humans are equipped with survival circuits that enables reflexive behavioral responses to evolutionary threats, this should be the case. Yet, we are not aware of studies that would report such effect.

We reasoned that if humans are equipped with phylogenetic neural adaptations that mediate behavioral responses to threat-relevant stimuli, these neural processes may trigger specific, stereotypical responses such as arm withdrawal (rather than speeding up all types of movements). If this is the case, the behavioral response may need to be measured using a naturalistic paradigm instead of, for instance, a button-press. To this end, we developed a paradigm where a participant directly interacts with a stimulus presented on a large touchscreen monitor by either touching it (i.e., approach movement), or withdrawing from it (Fig. 1a). The participants performed a go/no-go task where their task was to respond (either by approach or withdrawal movement) if the image contained an animal (snake, spider, bird, or a butterfly). When the image did not contain an animal (these images included pine cones, mushrooms, leaves, or flowers), the participant was required to keep their hand still. If the brain initiates reflexive avoidance of potentially threatening stimuli, participants should withdraw faster from snakes, and possibly also spiders [22], compared to birds and butterflies (which humans rarely report fearing). For the same reason, it might also take longer for participants to approach snakes, or spiders than birds, or butterflies.

While theories typically assume that threat-relevant stimuli produce responses with shorter reaction times (RTs) than non-threatening stimuli, threat-related stimuli could also trigger more vigorous arm movements [23]. From an evolutionarily point-of-view, it would be advantageous to withdraw from threats such as snakes both with low reaction latency and with high acceleration to increase the chances of, for example, avoiding a snake bite. To this end, we measured behavioral responses using an accelerometer attached to the participant's hand which allowed us to test, not only whether different animal stimuli evoke different RT, but also test if specific animal classes trigger more vigorous responses than others.

Figure 1. Behavioral paradigm and measures. a) Participant's task was to either withdraw from, or approach with his/her hand an animal presented on a large touch screen monitor. The participant was instructed to not to move his/her hand when the image did not contain an animal (i.e., go/no-go task). b) An accelerometer attached to the participants hand was used to measure RT, and arm acceleration. The image displays a single participant's data in the Withdraw condition (one trial, and the corresponding RT and peak acceleration is displayed in red). Zero acceleration indicates that hand velocity was constant. Here, positive acceleration indicates that the arm was moving away from the screen at increasing velocity. RT latency corresponds to the time point where arm acceleration first deviates from zero. Peak positive acceleration refers to the point of time where the participant's withdrawal velocity is increasing at the fastest rate. Negative acceleration indicates that the participant's hand movement is slowing down. c) Scatter density plot showing arm peak acceleration as a function of RT (data: whole sample of withdraw condition of the main behavioral experiment, each dot represents a single experimental trial). Photographs in panel a: Common European adder, Vipera berus, by Benny Trapp (https://commons.wikimedia.org/wiki/File:Benny_Trapp_Vipera_berus.jpg).

Results

Main Behavioral Experiment

For each trial, we calculated RT latency and peak arm acceleration (Fig. 1b). We used linear mixed-effects models to test if the experimental conditions modulated trial-by-trial variation in behavioral responses (see Methods for details). The results are visualized in Fig. 2. Participants' responses were highly accurate (Fig. 2, left column), and displayed only minor, and not statistically significant differences between different the experimental conditions. The results of a model predicting variation in RTs are shown in Table 1 (upper part). The intercept term shows that across participants, mean RT to butterfly stimuli in the Approach Condition was 304 ms. Lack of main effect of different animal categories indicates that in the Approach condition, participants' RTs were not statistically significantly modulated by the species they responded to. In the Withdraw condition, RTs were on average 95 ms slower than in the Approach condition. Crucially, interactions between Withdraw condition and Snake/Spider animals shows that when participants withdrew from the image, these two types of images were associated with about 19 ms (t = -2.60) and 27 ms (t = -3.77) speed-up of RTs, respectively. This result shows that participants *withdrew* from snakes and spiders at faster RT latency (Fig. 2, middle column). Peak acceleration was negatively associated with RT latency: Increase in peak arm acceleration corresponding to standard deviation was associated with about 5.5 ms faster RTs.

Figure 2. Behavioral results. The Approach condition is visualized in blue, and the Withdraw condition in red. Columns show response accuracy, RT, and peak acceleration, respectively. Error bars display the 95% CI.

Table 1. Results of mixed-effects regression analysis (Main behavioral experiment)						
Parameter	Estimate	SE	t	p	Lower 95% CI	Upper 95% CI
Reaction time (df = 3006, R^2 adjusted = .41)						
Intercept (Approach, Butterfly)	304.06	7.52	40.41	<.001	289.30	318.81
Bird	-10.87	7.29	-1.49	0.14	-25.16	3.42
Snake	-6.36	7.28	-0.87	0.38	-20.64	7.92
Spider	7.64	7.27	1.05	0.29	-6.62	21.90
Withdraw	95.22	9.59	9.93	<.001	76.41	114.02
Peak acceleration (z)	-5.58	3.10	-1.80	0.07	-11.65	0.50
Bird:Withdraw	-2.93	7.30	-0.40	0.69	-17.23	11.38
Snake:Withdraw	-18.90	7.28	-2.60	0.01	-33.18	-4.62
Spider:Withdraw	-27.44	7.28	-3.77	<.001	-41.71	-13.17
Peak acceleration (df = 2973, R^2 adjusted = .89)						
Intercept (Approach, Butterfly)	7.45	0.58	12.80	<.001	6.31	8.59
Bird	-0.04	0.12	-0.31	0.76	-0.27	0.19
Snake	0.23	0.12	1.94	0.05	0.00	0.45
Spider	0.31	0.12	2.68	0.01	0.08	0.54
Withdraw	4.46	0.80	5.58	<.001	2.90	6.03
RT (z)	-0.06	0.04	-1.78	0.08	-0.13	0.01
Bird:Withdraw	0.15	0.18	0.80	0.43	-0.21	0.50
Snake:Withdraw	0.40	0.18	2.22	0.03	0.05	0.76
Spider:Withdraw	0.36	0.18	1.98	0.05	0.00	0.72
y ~ Animal*Withdraw + RTorAcceleration + (1+Withdraw | ID) + (1+Withdraw | stimulus)						

Next, we examined if the target animal species, or the type of behavioral response predicted peak arm acceleration (Table 1, lower part). The intercept represents the Approach/Butterfly condition, indicating that peak response acceleration was on average 7.4 m/s². The main effects of snake and spider animal categories indicate that participants' approach responses to these species evoked responses with 0.23 m/s² (t = 1.94), and 0.31 m/s² (t = 2.68) higher peak acceleration, respectively. Interaction effects between these two species and Withdraw condition indicate that in the Withdrawal condition, arm acceleration was further increased by 0.40 m/s² (t = 2.22), and 0.36 m/s² (t = 1.98) for snakes and spiders respectively. This means that altogether based on the model, in the Withdraw condition arm acceleration was 0.63 m/s², and 0.67 m/s² faster for snakes and spiders when compared to butterflies. In general, arm acceleration was 4.4 m/s² slower in the Approach condition (likely because participants had to restrict the velocity of their arm in order to

not hit the touch screen monitor), and one SD decrease in RT predicted 0.06 m/s^2 faster arm acceleration.

So far, the results show that within participants, snakes and spiders evoke faster withdrawal RTs and higher arm acceleration. Next, we examined if subjectively experienced aversiveness of the animal species (see Methods for details) predicts variation *between participants* (in RT, and peak hand acceleration). The results showed that while aversiveness of the animal did not predict approach RTs (t = -0.64) or acceleration (t = 0.021), in the withdraw condition, higher aversiveness was associated with faster RTs (8.8 ms faster responses per unit increase in rating, t = -4.00), and higher arm acceleration (0.14 m/s^2 higher acceleration per unit increase in rating, t = 2.34). The result is visualized in Supplementary Figure 1, and the full results of the regression model are presented in Supplementary Table 1.

Control Experiment
To determine if the naturalistic paradigm was curial for observing the behavioral results, we next tested if similar results are obtained when RT is measured using a button press/release task. In this control experiment, participants were instructed to respond either by pressing a button (mimicking the Approach condition), or by releasing the button (mimicking the Withdrawal condition). The results (Supplementary Fig. 2) showed that while accuracy was very high in general, the participants made somewhat more mistakes in snake and spider conditions (compared to bird and butterfly; however, this effect was driven by three outlier participants). As shown in Supplementary Table 2, RTs revealed no statistically significant differences between different animal conditions in either button press, or release conditions, and in fact, participants responded fastest to bird stimuli (in both button-press and release conditions). This indicates that a naturalistic research setting was necessary for detecting rapid behavioral responses to threat-relevant stimuli.

EEG Experiment
One of the main shortcomings of previous research on the ERP correlates of threat detection is that the studies have not actually tested whether P1, or EPN amplitude actually correlates with behavioral responding such as RTs. We tested the electrophysiological correlates of naturalistic withdrawal responses by combining the behavioral paradigm with EEG (only the Withdraw condition). In general, the behavioral results (Fig. 3) replicate the earlier findings: Withdrawal RTs were fastest to snakes, although the size of the effect was about half of what was observed previously (12.3 ms). Unlike in the previous experiment, participants did not withdraw more rapidly from spiders. Peak arm withdrawal acceleration was higher for both snakes and spiders (than butterflies, or birds), and the size of the effect is comparable to the main behavioral experiment. The full behavioral results are displayed n Supplementary Table 3.

Similar to the main behavioral results, between-participant variation fear ratings predicted withdrawal RTs and arm peak acceleration: Higher reported fear was associated with faster RTs (β = -1.41 per unit increase in fear rating, t = -2.11), and faster arm acceleration (β = 0.13 per unit increase in fear rating, t = 2.60).

Figure 3. Behavioral results of the EEG experiment. Error bars display 95% CI.

As shown in Fig. 4a, the animal images evoked ERPs with prominent P1 (80–100 ms), and N1 (120–140 ms) waves in the occipital electrodes. These were followed by a series of waves between 200–500 ms. We first visualized general differences in ERPs to threat-relevant vs non-threat-relevant images (Fig. 4b). This revealed three time-windows where threat-relevance seemed to modify ERP amplitudes: Threat-related stimuli were associated with changes in P1 (peak around 90 ms after stimulus onset) and N1 (peak around 150 after stimulus onset) amplitudes, and threat-related images produced more negative amplitudes between 200–300 ms, corresponding to the EPN. As shown in Fig. 4c, arm withdrawal RT strongly influenced ERPs between 240–800 ms, and as previously reported [24,25] movement produces a clear time-varying positive wave whose timing corresponds to the RT.

We used linear mixed-effects models to test if animal species and the (z scored) behavioral metrics (RT and peak acceleration) predicted P1 (channels O1, O2, and Iz), N1 (channels P7 and P8), and EPN (channels O1, O2, and Iz) amplitudes. Because the models did not reveal interactions between animal category and RT, or peak acceleration, the interaction terms were removed from the final models. The results are presented in Table 2. Snakes produced the strongest P1 waves (t = 2.7, compared to butterflies), and birds were associated with smallest P1 amplitudes (t = -5.3, compared to butterflies). Faster RTs were associated with stronger P1 amplitude (Fig. 5, left panel). Peak acceleration was not statistically significantly associated P1 amplitude.

In N1 time-window, both snakes (t = 7.8, compared to butterflies) and spiders (t = 10.6, compared to butterflies) were associated with decreased N1 amplitudes. Yet, across stimuli, faster RTs were associated with stronger N1 amplitudes (Fig. 5, middle panel). Peak acceleration was not statistically significantly associated N1 amplitude.

Finally, as expected, in the EPN time-window, snakes and spiders produced stronger EPN than butterflies, and birds evoked the least strong EPN (absolute t values ≥ 4.3). However, interestingly, EPN amplitude was inversely correlated with RT: The stronger the EPN (i.e., the more negative the amplitudes), the slower the RT (Fig. 5, right panel). This is at odds with the common assumption that EPN mediates rapid behavioral avoidance by allocating attention towards threatening animals.

Figure 4. Grand average ERP. a) ERPs to different animal categories (mean of channels O1, O2, and Iz). b) Difference wave between threat-relevant (snake and spider) vs. non-treat-relevant images (bird, and butterfly), and the corresponding scalp maps at specified latencies. Each line represents one channel. c) ERP-image visualizing how arm movement influenced single-trial ERPs (mean of channels O1, O2, and Iz). Each experimental trial has been color coded (red = positive amplitude, blue = negative), and the trials have been sorted according to RT. Vertical solid line at 0 ms indicates the onset of the visual stimulus. The arched solid line shows the RT in the corresponding trials. Dashed vertical line shows the 240 ms time point corresponding to the end of the EPN time-window. The ERP-image has been smoothed by Gaussian moving average (SD = 5 trials). Grand average ERP is presented below the ERP-image. The red line represents the ERP of the fastest 50% of trials, and the black line the slowest 50% of trials.

Table 2. Results of the mixed-effects regression analysis on ERP amplitudes						
Parameter	Estimate	SE	t	p	Lower 95% CI	Upper 95% CI
P1 (70–110 ms, df = 7109, R^2 adjusted = .33)						
Intercept (Butterfly)	3.71	0.70	5.30	<.001	2.34	5.09
Bird	-0.90	0.17	-5.30	<.001	-1.24	-0.57
Snake	0.47	0.17	2.70	0.01	0.13	0.81
Spider	0.16	0.17	0.92	0.36	-0.18	0.49
RT (z)	-0.48	0.07	-6.79	<.001	-0.62	-0.34
Peak acceleration (z)	-0.14	0.09	-1.54	0.12	-0.33	0.04
N1 (140–160ms, df = 7109, R^2 adjusted = .29)						
Intercept (Butterfly)	-0.31	0.50	-0.62	0.54	-1.29	0.67
Bird	0.36	0.13	2.71	0.01	0.10	0.62
Snake	1.05	0.13	7.85	<.001	0.79	1.32
Spider	1.40	0.13	10.60	<.001	1.14	1.66
RT (z)	0.31	0.05	5.73	<.001	0.21	0.42
Peak acceleration (z)	-0.02	0.07	-0.24	0.81	-0.16	0.12
EPN (200–220ms, df = 7109, R^2 adjusted = .37)						
Intercept (Butterfly)	6.44	0.66	9.82	<.001	5.15	7.72
Bird	0.65	0.15	4.33	<.001	0.35	0.94
Snake	-1.91	0.15	-12.50	<.001	-2.21	-1.61
Spider	-1.08	0.15	-7.22	<.001	-1.38	-0.79
RT (z)	-0.30	0.06	-4.87	<.001	-0.42	-0.18
Peak acceleration (z)	-0.05	0.08	-0.66	0.51	-0.22	0.11
y ~ Animal + RT + Acceleration + (1|ID)						

It could be argued that, although our EPN time-window (200–240 ms) precedes the motor responses (Fig. 4c), preparatory motor activation preceding the fastest RTs nevertheless conflate the measured EPN. To rule out this possibility, we excluded from the analyses RTs that were shorter than 420 ms. This way, any behavioral response took place a minimum of 200 ms after the EPN time-window. Despite this, P1 (t = -4.1), N1 (t = 2.7), and EPN (t = -2.3) amplitudes showed the same modulation by RT. This shows that the negative correlation between EPN and RT was not due to a motor confound. Peak acceleration was not statistically significantly associated EPN amplitude.

Figure 5. Correlation between RT and P1, N1, and EPN amplitudes (results of the regression model presented in Table 5). The dashed line is the 95% CI.

We also investigated if, across participants, mean ERP amplitudes (P1, N1, and EPN) correlated with participants' mean withdrawal RT and peak acceleration. The results (Supplementary Figure 3) did not reveal any significant correlations (highest absolute t value for main effects of RT, or peak acceleration was t = 0.96). This means that while P1, N1, and EPN correlate with RT and arm withdrawal acceleration within participants, similar association is not observed between participants.

Discussion
We have shown that animal species humans often report fearing (snakes and spiders) can trigger rapid behavioral withdrawal responses when compared to non-threatening species (butterflies and birds). In addition to shorter withdrawal RTs, the threat-relevant animals triggered faster arm acceleration. This speed-up of behavioral responding was only observed in a "naturalistic" paradigm, where individuals responded using arm movements. This suggests that the neural mechanisms that enable rapid withdrawal from threats do not constitute a "modality general" speed-up of behavioral responding, but needs to be measured using a naturalistic paradigm. Across participants, the speed of the withdrawal correlated with how aversive the participants experienced the animal species used as stimuli, suggesting that the speed of the withdrawal reaction also reflects trait-level differences between individuals. This suggests that the withdrawal speed could in future provide information about the possible relationship between pathologically

active or inactive threat-circuits, and neuropsychiatric condition (such as anxiety disorders, or psychopathy; [26–28]).

Within participants, the speed of the behavioral withdrawal reaction was associated with electrophysiological signatures that are typically interpreted as correlates of selective attention. Fast RTs were associated with stronger early brain responses (70–140 ms after stimulus onset). However, contrary to prevailing theories, stronger EPN amplitude (200–240 ms after stimulus onset) was associated with slower withdrawal. This suggests that rapid withdrawal from threat-related stimuli engages multiple attentional components that differentially contribute to withdrawal speed. Our results concerning the association between ERP amplitudes and behavioral responding are correlative, but because the ERP correlates preceded the behavioral responses, the ERPs may also be causally linked to the speed-up of behavioral responding.

Because our results show that rapid behavioral responding is linked specifically with withdraw movements, the results support the interpretation that the response is mediated by "survival circuits" that mediate escaping from threats. In addition to being based on "naturalistic movements", we suggest that a key factor in the present paradigm is that it mimicked *interaction* with the stimuli. If our interpretation holds, then the speed-up of behavioral withdrawal may only be observed when the participant is close enough to the stimulus, as was the case in the present study. Studies on non-human animals using naturalistic experimental paradigms suggest that basolateral amygdala activation strongly correlates with the initiated behavioral response (e.g., its velocity), but also maps the distance to the threat [29,30].

We utilized an accelerometer to measure behavioral responses to the stimuli, which allowed us to examine not only RTs, but also if arm acceleration was modulated by the threat-relevant stimuli. From an evolutionary perspective, it would make sense that animals withdraw from threatening stimuli, not just with rapid latency, but also with high acceleration, to maximize the chances of escape. Our results show that although RT and arm peak acceleration correlated, the effects of threat on RT and arm peak acceleration could be dissociated: Whereas the effect of threat on RT was solely linked to withdrawal responses, hand acceleration was modulated by threat also during approach behavior (although also arm acceleration to threats was further increased when participants withdraw from the stimuli). Also, while the amplitude of ERPs predicted RTs, the neural correlates of withdrawal acceleration remain to be elucidated.

Our results show that snake stimuli evoked amplified ERP responses already 70–110 ms after stimulus onset (P1 wave). This early response likely indicates that relatively low-level visual processes signaled the presence of a potentially threatening stimulus when snakes were presented. The main source of the P1 localizes to early visual cortices [31,32], and it is often assumed to precede the earliest correlate of conscious visual perception [33]. This suggests that snake detection may be mediated by processes that precede conscious perception. While rapid unconscious responses to threat-relevant stimuli are often explained by referring to "low-road" pathways that bypass the cortex, the present results suggest that also very fast and possibly unconscious cortical "high-road" responses signal snake detection [8]. Since the animal stimuli in the present study were consciously perceived, the present results do not demonstrate that unconscious processes *alone* are sufficient to explain fast behavioral withdrawal from snake images. Research suggests that both fast RTs [34] as well as responding to snakes require conscious perception [35,36].

In the present EEG experiment, snakes elicited fastest behavioral responses and earliest ERP correlates. In the main behavioral experiment, both spiders and snakes evoked comparably rapid withdrawal responses. This difference in the results of the two experiments may be related to methodological differences between the experiment. The EEG experiment was considerably longer, and only included the Withdraw condition (also, RTs were generally slower in the EEG experiment). Previous studies using schematic stimuli have shown that also spider stimuli may evoke enhanced responses during the earliest stages of cortical processing [32].

A key novel finding in the present study is that the amplitude of the P1 response positively correlated, not just with snake "detection", but also with behavioral withdrawal RT. This suggests that the same mechanism that gives threat-relevant stimuli attentional priority early on in visual processing also influences the speed of behavioral withdrawal. Similar to P1, higher N1 amplitudes were associated with faster RTs (in line with the interpretation that "stronger" stimulus-evoked activity was associated with faster RTs). The correlation between P1 (and N1) and withdrawal RTs was observed across all animal stimuli, suggesting that the neural mechanisms that enable fast withdrawal responses are not specific to snakes. Rather, snake stimuli engaged this early amplification mechanism that increased the probability of fast behavioral withdrawal. Consistent with this, P1 amplitudes correlate with multiple different types of threats [37].

In addition to the effects on early ERPs, threat-relevant stimuli evoked stronger negativity around 200 ms after stimulus onset, known as the EPN [12,13,36]. Given the similarities to an ERP correlate of feature-based attention known as selection negativity [38,39], EPN is typically interpreted as a sign of attention towards the features of the threat-relevant stimulus. Furthermore, conscious perception of visual stimuli correlates with activity in a similar time-window and electrodes as EPN [33], and Grassini et al. have shown that snake and spider images only elicit EPN when participants consciously perceive the stimuli [36]. This means that EPN may reflect processes related to conscious perception of stimulus details. Intriguingly, our results show that higher EPN amplitudes were associated with slower withdrawal latency. This suggests that rapid withdrawal responses are based on automatic, reflex-like processing. Attention towards stimulus-features to consciously discriminate the stimulus details may interrupt this automatic process, and consequently delay fast withdrawal.

Conclusions

Our results show that images of snakes and spiders elicit fast and vigorous arm withdrawal in humans. Because similar effect was not observed with approach movements, or button-press/release responding, the result suggests that these species activate neural "survival circuits" associated with escape and avoidance. Our electrophysiological results suggest that the fast withdrawal was based on two opposite attentional processes that preceded the behavioral response. First, presence of threat was signaled by early amplification of the stimulus-related activation. Second, conscious attention to details of the stimulus was associated with slower withdrawal reactions. This suggests that rapid behavioral withdrawal is mediated by automatic reflex-like circuits which are interrupted by conscious voluntary processing of the stimuli.

Methods
Participants

Experiment 1: Thirty-one participants took part in Experiment 1 (7 men, 24 women; age 18–36 years old). Three participants were excluded from the analysis (2 because they were missing either the Withdraw or Approach condition, and one because her long fingernails impeded data collection). Control Experiment: 25 right-handed participants (6 men; age 20–39 years old, and handedness). One participant was excluded from the analysis, because she had no correct answers in the experiment. EEG experiment: Thirty right-handed participants (5 male, age 19–38 years) took part in the experiment. Three participants were excluded from the analysis due to noisy EEG. Participants in all studies had no diagnosed neurological disorders, and reported either normal or corrected to normal vision. Participants gave written informed consent before participation in the study. The study was conducted according to the principles of the Declaration of Helsinki, and was approved by the Ethics Committee for Human Sciences at the University of Turku.

Stimuli and procedure
The stimuli included photos of snakes, spiders, birds, and butterflies, and photos of mushrooms, pinecones, leaves, and flowers. Each category included 28 different stimuli. The luminance histograms of all stimuli (each RGB layer) were matched with the SHINE toolbox [40] so that differences in RTs, or ERP amplitudes are not likely to be related to differences in stimulus luminance. Spatial frequency distribution of stimuli was not equated because this manipulation would also likely reduce visibility of the cues the visual system uses to detect, e.g., snakes [41]. The image resolution was 600 x 450 pixels (37,5 cm x 28 cm on the display). The object displayed on the image was roughly similar in size between different animal conditions. The object was located near the center of the image, and it was clearly visible against the background.

The experiment consisted of a go/no-go task, where participants were seated in front of a large touch screen monitor (Phillips Signage Solutions Multi-Touch Full HD 55" monitor with a 1920 x 1080 resolution, and 60 Hz refresh rate). The experiment consisted of two response conditions: Approach and Withdrawal. In the Approach condition, participants were asked to touch the screen with their finger every time an animal was shown. At the beginning of each trial, the participant kept his/her hand on a platform in front of the touch screen monitor. In the Withdraw condition, participants were asked to hold their finger on the screen (near the center of the screen where the animal may be presented), and withdraw their arm near their torso as soon as they saw an animal. The participants were instructed to respond rapidly, but not to move their hand when no animal was present in the photo. After each trial, the monitor returned to the start screen. The participants were asked to position themselves so that when they extended their arm, they were able to comfortably touch the screen with their finger. Participants performed practice trials of both conditions before the experiment (stimuli used in the practice trials were different that those presented in the main experiment). The Approach and Withdraw conditions each contained 14 different images per stimulus category, presented in random order. Each participant saw each image only once, but stimulus presentation was counterbalanced so that across participants each image was presented in Approach or Withdraw condition with equal probability. The order of the Approach and Withdraw conditions was also counterbalanced across participants. The stimuli were presented using Presentation software (v.22.0/05.10.20). In the Control Experiment, the procedure was identical, but participants responded by pressing ("approach") or releasing ("withdraw") a button on a game pad using the thumb of their right hand.

In the main behavioral experiment (but not in the control or EEG experiments), after the participant had completed the behavioral task, he/she was asked to rate on a scale from 0–4 how

difficult it would be for them to touch the animal presented in the image: The participant viewed each stimulus (unlimited duration), and reported the rating by pressing a button on the touch-screen monitor. In the instructions, we emphasized, that the participant should consider the specific animal picture that was presented, not the species in general. The highest alternative meant that they would certainly not want to touch the animal, whereas the lowest alternative meant that they could easily touch the animal. We call this variable "Aversiveness rating".

At the end of each experiment, we asked participant to rate on a scale from 0 to 4 how much they generally feared snakes, spiders, butterflies and birds (0 = not at all, 4 = very much). Across the experiments, the participants systematically rated higher fear of snakes (M = 1.96, SD = 1.14) and spiders (M = 2.00, SD = 1.12) than birds (M = 0.32, SD = 0.66) and butterflies (M = 0.35, SD = 0.84).

In the EEG Experiment, participants only completed the Withdraw condition, and performed multiple experimental blocks (meaning that participants were presented with the same stimuli multiple times). One experimental EEG block included 112 trials (14 stimuli per 8 different stimulus categories). Each participant completed 14–17 blocks in total (i.e., 196–238 trials per condition, per participant).

Accelerometer
Arm acceleration was recorded with an MPU6050 accelerometer that was attached on the participant's wrist with velcro. The sampling frequency of the accelerometer was 100 Hz, and it measured acceleration in three spatial dimensions. The accelerometer is sensitive to the earth's gravitation, and before each experimental block it was calibrated so that acceleration was 0 m/s^2 in all three directions. During the calibration, the participant held their hand in a specific position (platform in front of the monitor in the Approach condition, and in the Withdraw condition they held their index finger near the center of the monitor surface) without moving it. The accelerometer was controlled by two Arduino Uno (ATmega328P Arduino Uno R3 AVR® ATmega AVR MCU) units. One of the units was connected to a Dell Latitude E5540 laptop, on which Presentation was run, and the other one was connected to a laptop running a Cool Term win software, which was used to convert the accelerometer output into a text file. Markers indicating stimulus presentation were also printed on the text file with the accelerometer data.

During data analysis, only the dimension of acceleration that measured the approach/withdraw direction was considered (i.e., lateral, and vertical acceleration were not analyzed). The acceleration data was cut to segments corresponding to individual trials, spanning from −200 to 1000 ms relative to stimulus onset. After this, the data was further baseline corrected, so that during the prestimulus time-window acceleration was, on average, 0 m/s^2 for each trial. Additional baseline correction was necessary, because despite initial calibration in the beginning of each experimental block, small changes in arm angle or rotation changed baseline acceleration values away from 0 m/s^2. Peak withdrawal, or approach acceleration was determined for each trial (maximum acceleration in given direction after stimulus onset). Peak withdrawal acceleration was changed to absolute value (to make the negative withdrawal acceleration comparable to positive approach acceleration). RT was determined by searching for the first sample where acceleration began to continuously approach the peak acceleration.

EEG

EEG was recorded with 32 passive electrodes placed according to the 10-10 electrode system (EasyCap GmbH, Herrsching, Germany). Surface electromyograms (EMGs) were measured with two electrodes placed below and to the side of the left eye. Reference electrode was placed on the nose, and ground electrode on the forehead. EEG was recorded with a NeurOne Tesla amplifier using 1.4.1.64 software (Mega Electronics Ltd., Kuopio, Finland). Sampling rate was 500 Hz.

EEG data was processed using EEGlab [42] software running on Matlab R2020b. First, a marker representing the latency of arm movement onset was added to the data. Here, the movement onset latency was retrieved from the touch screen data, as it measured RT with higher resolution than the accelerometer. This marker also contained the peak acceleration of the arm movement (measured using the accelerometer). After this, EEG data was high-pass filtered (1 Hz), and then low-pass filtered (40 Hz). Bad electrodes were removed, reference was changed to average, the data was epoched, and independent component analysis was run. IC label [43] was used to keep independent components with at least 70% probability that the component was brain-based. Outlier trials were rejected using joint probability functions with the criteria of three standard deviations. Finally, removed channels were interpolated back into the data.

ERP analysis was performed in P1 (70–110 ms), N1 (140–160 ms), and EPN (200–240 ms) time-windows. After visually inspecting differences between threat-relevant (snake and spider stimuli), and non-threat conditions (butterfly and bird), P1 and EPN analysis was focused on electrodes over the occipital pole (O1, O2, and Iz), and N1 analysis was based on lateral occipitoparietal electrodes (P7 and P8) because threat-related modulation was strongest around these electrodes (see, Fig. 4b).

Statistical analysis
RT and peak acceleration analyses were based on trials where the participants made a behavioral response to the presented animal stimulus. The data was analyzed on single-trial data using linear mixed-effects models. For the main behavioral experiment and the control experiment (with button-press/release responding) the model was as follows: *Dependent_variable ~ Response_condition * Animal_category + RT_or_acceleration + (1 + Response_condition | Participant) + (1 + Response_condition | Stimulus)*, where *Dependent_variable* is either RT or peak acceleration, *RT_or_acceleration* is the z scored RT or acceleration (depending on which was the dependent variable), and *Stimulus* refers to the specific animal stimulus presented in the given trial. The random-effect structure thus included between-participant variation in response speed (i.e., intercept) as well as in how response condition influenced the behavioral response. In addition, the random-effects structure took into account variation between individual stimuli. This was considered important because differences between photos could potentially influence RT or arm acceleration (due to differences in, e.g., the size and orientation of the animal, there may be systematic variation in responses to specific stimuli). This fixed- and random-effect structure led to best models based on Akaike and Bayesian Information Criteria. In the models, the intercept represents the Approach/Butterfly condition. In the EEG experiment, data was analyzed using following linear-mixed effects models: *Dependent_variable ~ Animal_category + RT + Acceleration + (1|ID)*.

Reported aversiveness of the stimulus (which was collected as part of the main behavioral experiment), or participants' general fear of the stimulus species was not included in the

regression models because these predictors were strongly collinear with the *Animal_category* predictor. Instead, we examined how between-participants variation in reported aversiveness predicted RTs and peak arm acceleration (in the main experiment). For each participant, we calculated mean RT, mean peak arm acceleration, and mean reported aversiveness of the presented stimuli for each animal category, and response condition. We then used *Withdraw*Aversiveness_rating + Animal + (1 + Withdraw|Participant)* regression models to investigate if aversiveness of the animal predicted behavioral responses (interactions between specific animal species and aversiveness did not approach significance so they were left out of the model). In the EEG experiment, following a similar procedure we examined if between-participant variation in mean RT, or mean peak acceleration predicted ERP amplitude (*y ~ Animal + RT + peak_acceleration + (1|Participant)*).

The data and the analysis scripts are available at https://osf.io/j6sqx/.

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Author contributions
H.R.: designed the study, analyzed the data, wrote the manuscript, and supervised data collection. T.L. wrote the experimental scripts and build the apparatus to measure behavioral responses with accelerometer. N.K. Collected data, and analyzed the EEG data. J.S. Collected data.

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Supplementary Figure 1. Association between reported aversiveness and behavioral withdrawal responses. a) Relative frequency of different aversiveness ratings for the four animal categories. b) RT as a function of aversiveness rating. c) Peak acceleration as a function of aversiveness rating. Different line colors indicate different animal stimuli. The two lowest RT and peak acceleration values are not displayed for birds and butterflies because of small number of observations. Error bars display the SEM.

Name	Estimate	SE	t	p	Lower 95% CI	Upper 95% CI
Supplementary Table 1. Correlation between fear of the stimulus and behavioral response across participants						
Reaction time (df = 224, R^2 adjusted = .87)						
(Intercept)	331.58	5.02	66.07	<.001	321.69	341.47
Aversiveness rating	-1.58	2.46	-0.64	0.52	-6.42	3.26
Bird	-6.20	4.19	-1.48	0.14	-14.47	2.06
Snake	-1.95	6.25	-0.31	0.76	-14.28	10.37
Spider	8.00	7.09	1.13	0.26	-5.98	21.98
Condition_Withdraw	71.90	8.11	8.86	<.001	55.91	87.88
Aversiveness:Withdraw	-8.86	2.22	-4.00	<.001	-13.23	-4.49
Peak acceleration (df = 224, R^2 adjusted = .98)						
(Intercept)	7.47	0.58	12.95	<.001	6.33	8.60
Aversiveness rating	0.00	0.07	-0.02	0.98	-0.14	0.14
Bird	0.05	0.11	0.48	0.63	-0.16	0.26
Snake	0.39	0.17	2.32	0.02	0.06	0.71
Spider	0.35	0.19	1.85	0.07	-0.02	0.72
Condition_Withdraw	4.35	0.77	5.66	<.001	2.84	5.86
Aversiveness:Withdraw	0.14	0.06	2.34	0.02	0.02	0.25
y ~ Animal + (Withdraw * Aversiveness) + (1 + Withdraw|ID)'						

Supplementary Figure 2. Results of the control experiment. Blue line is the button-press condition, and red line the button-release condition. Error bars display the 95% CI.

Supplementary Table 2. Results of mixed-effects regression analysis on RT in the control experiment (df = 2591, R^2 adjusted = .34)						
Parameter	Estimate	SE	t	p	Lower 95% CI	Upper 95% CI
Intercept (Butterfly, button-press)	414.66	10.44	39.71	<.001	394.19	435.14
Bird	-1.34	6.46	-0.21	0.84	-14.00	11.32
Snake	4.91	6.46	0.76	0.45	-7.77	17.58
Spider	9.29	6.46	1.44	0.15	-3.37	21.96
Button-release	15.34	8.53	1.80	0.07	-1.38	32.07
Bird:Button-release	-11.12	7.75	-1.43	0.15	-26.33	4.08
Snake:Button-release	-6.30	7.75	-0.81	0.42	-21.50	8.89
Spider:Button-release	-4.54	7.74	-0.59	0.56	-19.71	10.64
y ~ Animal*ReleaseCondition + (1+ReleaseCondition|ID) + (1+ReleaseCondition|stimulus)						

Supplementary Table 3. Results of the mixed-effects regression model on behavioral data of the EEG experiment						
Parameter	Estimate	SE	t	p	Lower 95% CI	Upper 95% CI
Reaction time (df = 7903, R^2 adjusted = .30)						
Intercept (Butterfly)	459.62	8.25	55.72	<.001	443.45	475.79
Snake	-12.37	4.29	-2.88	<.001	-20.77	-3.96
Spider	-3.03	4.28	-0.71	0.48	-11.42	5.36
Bird	-4.09	4.27	-0.96	0.34	-12.46	4.29
Peak acceleration (z)	-4.05	1.12	-3.63	<.001	-6.25	-1.86
Peak acceleration (df = 7741, R^2 adjusted = .65)						
Intercept (Butterfly)	10.23	0.66	15.46	<.001	8.93	11.52
Snake	0.70	0.08	9.25	<.001	0.55	0.85
Spider	0.54	0.08	7.17	<.001	0.39	0.69
Bird	-0.16	0.07	-2.18	0.03	-0.31	-0.02
RT (z)	-0.10	0.03	-3.13	<.001	-0.16	-0.04
y ~ Animal + RTorAcceleration + (1|ID) + (1|stimulus)						

Supplementary Figure 3. Between-participants association between behavioral metrics and ERPs. The top three plots display mean RT, and the bottom three plots the mean acceleration. The three columns of plots display relationship with different ERPs waves: P1 (leftmost), N1 (middle), and EPN (rightmost), respectively. Each dot represents one participant's mean data. Different colors denote different animal stimulus categories. The lines are simple least-squares fits across the data points.