

Effect of Ambient Temperature and Humidity on Muscle Fatigue of Pilots

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ABSTRACT

From scientific research and accident investigations, we are aware of the effects of fatigue on our performance. Pilots' fatigue has been considered a contributing factor in various aviation accidents; many researchers found that pilots' muscle fatigue makes pilots slow to respond and slow down their movements, which will bring potential safety hazards to flight. This study aims to investigate the effect of different cockpit ambient temperatures (Ta) and relative humidity (RH) on pilots' muscle fatigue. Thirteen subjects participated in the simulated flight experiments at 21°C/30%, 30°C/45%, and 38°C/60%RH. Continuous measurement of the skin temperature (Tsk) and skin humidity (Hsk) throughout the experiment, the surface electromyography (EMG) signals of biceps brachii (BB), flexor carpi radialis (FCR), rectus femoris (RF), and tibialis anterior (TA) were recorded, the mean power frequency (MPF) of EMG data were analyzed. This study found that the mean power frequency of rectus femoris (RF) and tibialis anterior (TA) at 38°C/60% and 30°C/45% were lower than 21°C/30% ($p < 0.001$), and the MPF of RF at the high ambient temperatures and relative humidity condition was lower than that of TA, biceps brachii (BB) and flexor carpi radialis (FCR) ($p < 0.001$). Through the analysis of binary linear regression, it was found that there was a relationship between ambient temperatures and relative humidity and the change of root mean square ($p < 0.003$). This study showed that the ambient temperatures and relative humidity would impact flight fatigue, and high temperature and humidity are more likely to cause fatigue. Also, in this study, the rectus femoris is more likely to cause fatigue during flight. This study can provide a reference for biological therapies targeting flight fatigue and fatigue prevention of fighter pilots.

Keywords: Flight fatigue, Surface electromyography, High temperature, High humidity, Cockpit

INTRODUCTION

Pilots' fatigue has been considered a contributing factor in various aviation accidents. Data from the US Army Safety Center shows that fatigue is involved in 4% of army accidents, and statistics from the Air Force Safety Center blame fatigue, at least in part, for 7.8% of Air Force Class A mishaps (Gaines et al., 2020). Pilots are affected by high temperatures and humidity when flying at low altitudes or entering the first-level combat readiness state

(Nunneley et al., 1981). Previous studies have shown that high cabin thermal load may lead to pilot muscle fatigue and thermal discomfort (Lee and Kim, 2018; Murray et al., 2016b). After flight fatigue will make pilots slow to respond and slow down their movements, which will bring potential safety hazards to flight (Diaz-Piedra et al., 2016). Therefore, it is a critical problem to study the surface electromyographic signals of ambient temperature and humidity on the pilot.

Muscle fatigue represents a complex phenomenon encompassing various causes, mechanisms, and forms of manifestation. Some researchers have shown that many factors contribute to pilot fatigue. Arsintescu et al. studied the relationship between pilot workload, performance, subjective fatigue, sleep duration, and flight duration during short-haul operations; they found that time was not an essential factor causing fatigue for short flights (Arsintescu et al., 2020). Caldwell et al. researched the effects of sleep on pilot and crew fatigue. They found that good sleep can reduce fatigue and enhance the productivity and safety of air ambulance operations (Caldwell, 2001). Booyong et al. conducted real-time monitoring of gastrocnemius electromyography under overload flight training of pilots; they found that integrated absolute value and waveform length showed a rapid decay during the fatigue phase (Choi et al., 2015). However, there are few relevant studies to prove the impact of air ambient temperature and humidity on pilot fatigue.

Many studies have been performed yielding electromyography signal-based quantitative criteria of fatigue. Cifrek et al. gave an overview of classical and modern signal processing methods and techniques from the standpoint of applicability to EMG signals in fatigue-inducing situations, including time domain, frequency domain, time-frequency, time-scale representations, and other methods (Cifrek et al., 2009a). Xu et al. studied flight muscle fatigue using a Boeing 777-200ER flight simulator and a physiology monitoring system, and a hybrid multi-class Gaussian process model is proposed to identify the fatigue status of pilots by analyzing the surface electromyogram signals on the back of their neck and upper arm muscles (Xu et al., 2020), it indicated that the proposed method is feasible and precise. It has been reported that, during fatigue, there is an increase in the EMG signal amplitude and power and a decrease in both mean and median frequencies (Balasubramanian and Jayaraman, 2009; Nadal and Oliveira, 2004). In conclusion, it is reliable to evaluate fatigue by EMG.

Therefore, this experiment aimed to compare the effect of different cockpit temperatures and humidity environments on pilot-localized muscle fatigue by EMG. The experiment was conducted in the cockpit of a retired Chinese fighter jet, and all subjects were required to simulate the flight mission. It was hypothesized that high temperature and humidity would increase pilot fatigue, while skin temperature and skin wittedness would be the critical influence on EMG variables. This study can provide a reference for biological therapies targeting flight fatigue and fatigue prevention of fighter pilots.

METHODS

In this paper, based on the standard of anthropometric parameters of pilots, We recruited 13 volunteers for this experiment, with no physical disability or other restrictions, and their physical conditions met the requirements of the experiment. The average age was 23.6 ± 0.63 years, the height was 170.9 ± 4.22 cm, and the weight was 61.67 ± 5.16 kg. When recruiting volunteers, inform the experimental process and the risks associated with the study and sign informed consent forms. Before the beginning of the experiment, all the volunteers carried out the same intensity simulation flight training and were familiar with the experimental task.

The equipment used in the present experiments included: a 3rd-generation fighter cockpit (Fig. 1), the capsule anti-G suits, the Noraxon-DTS16 wireless surface electromyography test system, and the iButton-DS1923 temperature and humidity sensors from Dallas Semiconductor. Cabin environmental control system temperature and humidity control range of $10 \sim 50^\circ\text{C}$, $20 \sim 90\% \text{RH}$, the accuracy of $\pm 0.2^\circ\text{C}$ and $\pm 5\%$, respectively. The measuring range of iButton-DS1923 was $-20 \sim 85^\circ\text{C}$ and $0 \sim 100\%$, and the accuracy of temperature and humidity are $\pm 0.5^\circ\text{C}$ and $\pm 5\%$, respectively.

Experimental protocol: This experiment was carried out in the simulated cockpit of a specific type of fighter; all subjects can simulate flight operations with the flight simulator in the cockpit. The summer weather south of the Yangtze River in China is hot and humid (Zhou et al., 2021). Pilots may be affected by the high temperature and humidity environment during the ground preparation phase before take-off, flying at a low altitude, or entering first-class combat readiness. Therefore, according to the Chinese early warning reference for high-temperature weather, the temperature and humidity in the cockpit are set to ($23 \pm 0.2^\circ\text{C}$, $30 \pm 5\% \text{RH}$, $30 \pm 0.2^\circ\text{C}$, $45 \pm 5\% \text{RH}$, $38 \pm 0.2^\circ\text{C}$, $60 \pm 5\% \text{RH}$) respectively, and the flowing velocity of air less than 0.1 m/s . The subjects experienced the experiments in assigned random orders. The experiments were conducted between 9:00 and 10:00 am or 15:00 and 16:00, and each subject experimented at least 24h after the previous experiment. All subjects wore anti-G capsule suits to enter the simulated cockpit of the fighter. The experimental task process is shown in Fig. 1, and



Figure 1: Fighter cockpit for simulated flight experiments.

subjects simulated fighter take-off and cruise tasks. Also, the EMG signal was recorded five minutes before the last take-off of the fighter flight operation.

Parameter measurement: A wireless EMG sensor system from Noraxon acquired the raw EMG at a sampling frequency of 1,500 Hz (Cifrek et al., 2009b). As shown in Fig. 3(a), the surface EMG signals of biceps brachii (BB), flexor carpi radialis (FCR), rectus femoris (RF), and tibialis anterior (TA) on the right side was recorded in this paper. During measurement, the two recording electrodes were separated by 2cm and kept parallel to the myofiber axis (Cifrek et al., 2009b). The two recording electrodes formed an equilateral triangle with the reference electrode. Before placing the electrodes, the relevant skin areas were shaved and cleaned. The position of each measuring point of the body is shown in Fig. 3(b); the skin temperatures and humidity were recorded once per minute with iButton sensors.

The processing of EMG and the calculation of eigenvalues were achieved in MATLAB R2020a. A second-order notch filter with a 49–51 Hz band stop was utilized to eliminate alternating current line interference. Given the varying signal characteristics and noise in the wavelet domain, the original signals were reconstructed via wavelet transform, separating the noise from the original signals. The MPF and root mean square (RMS) was calculated. The critical parameters selected were the wavelet function db5 (Chowdhury et al., 2013).

In this paper, statistical analysis was performed with Origin 2018 software. According to the normality of the data, the Friedman test was carried out for the MPF, skin temperature, and humidity. To determine whether these

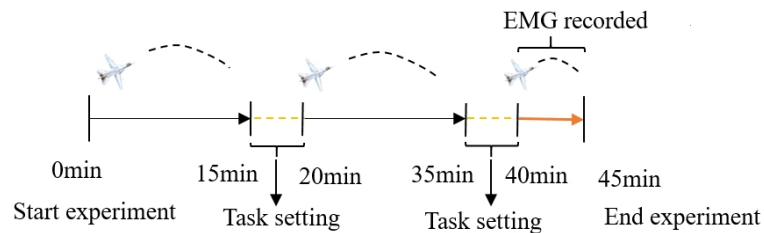


Figure 2: Experimental task process.

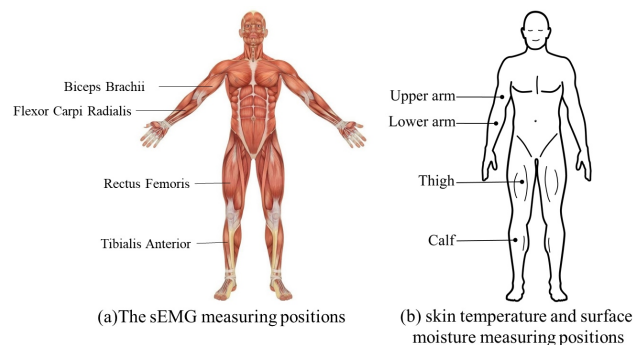


Figure 3: Parameter measuring positions.

features significantly differ among different conditions and muscle groups. Linear regression was used to analyze the changes in the MPF. Results were considered to be statistically significant at $p < 0.05$.

RESULTS

In order to analyze the effect of the cockpit air temperature and humidity on the muscle fatigue of volunteers, we analyzed the MPF of subjects during the simulated flight in this study. As shown in Fig. 4(a), the MPF of RF at 30°C/45% and 38°C/60% conditions were significantly decreased compared with that at 21°C/30% conditions ($p < 0.001$). The MPF of RF showed a decreasing trend at 38°C/60%, while it increased at 21°C/30% during this period. In terms of TA, Fig. 4(b) showed that the MPF of the TA under the conditions of 30°C/45% and 38°C/60% was significantly lower than that at 21°C/30% ($p < 0.001$), and the MPF of TA at 38°C/60% was also significantly lower than that at 30°C/30% ($p = 0.004$). Also, the MPF of TA showed a decreasing trend with time under all conditions. In addition, we analyzed the changes in the MPF of BB and FCR under different conditions. As shown in

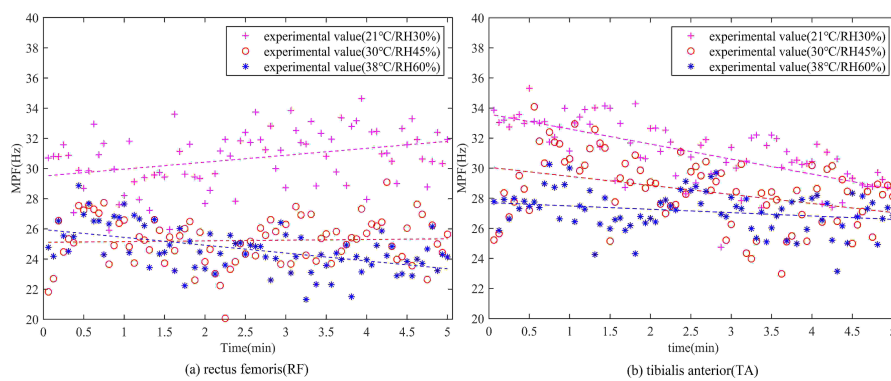


Figure 4: The MPF of rectus femoris (RF) and tibialis anterior (TA) at different conditions, “---” presented its one-order fitting.

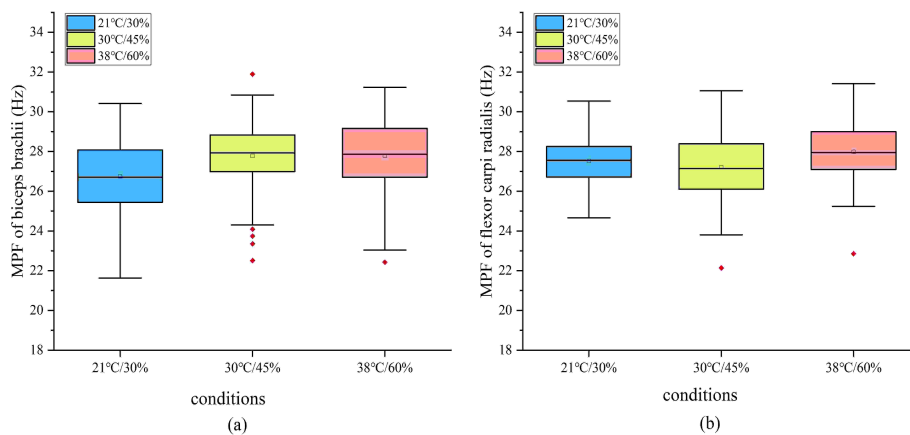


Figure 5: The MPF of biceps brachii(BB) and flexor carpi radialis(FCR) in subjects at different conditions.

Fig. 5(a) and 5(b), there was no significant difference in the MPF of BB and FCR among three varied working conditions.

Because the environment of high temperature and humidity may make volunteers more prone to fatigue, this paper analyzed the MPF of different muscles. As shown in Fig. 6, when subjects were exposed to the 38°C/60% condition, the MPF of RF was significantly lower than that of other muscles ($p < 0.001$). There was no significant difference between the MPF of BB, TA, and FCR ($p > 0.28$).

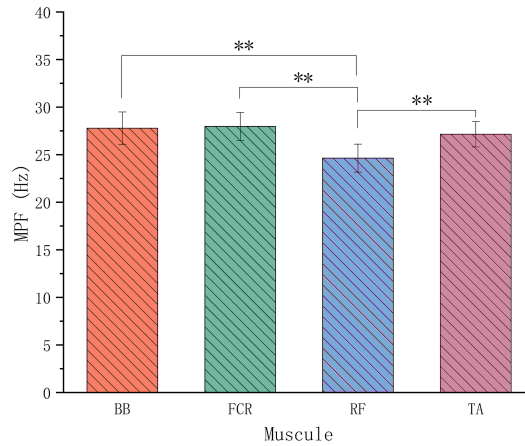


Figure 6: The MPF of different muscles at 38°C/60%, “***” denotes $p < 0.001$.

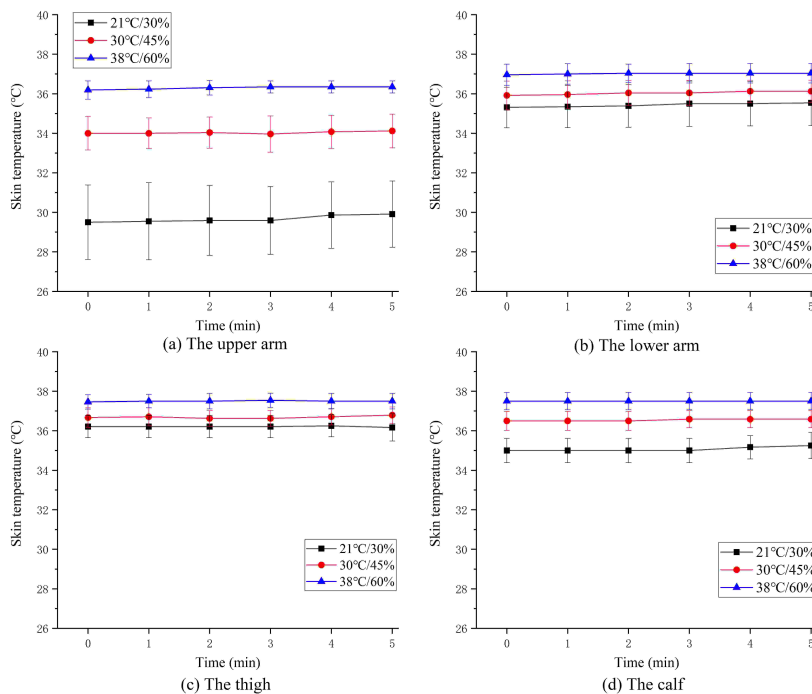


Figure 7: The skin temperature of all positions at different conditions.

In order to analyze the effect of skin temperature and skin humidity on electromyographic signals, the skin temperature of the subject's upper arm, lower arm, thigh, and the calf was tested. As shown in Fig. 7(a), 7(b), 7(c), and 7(d), the Tsk of all four positions at 38°C/60% was significantly higher than in other conditions. ($p < 0.05$). The Tsk of each position was different under the same condition, the upper arm was significantly lower than other positions ($p < 0.05$), and the skin temperature of each position had no significant difference with time ($p > 0.05$).

The local skin humidity was also analyzed in this paper. As shown in Fig. 8(a) and 8(c), the skin humidity of the thigh and upper arm had no difference between 21°C/30% and 30°C/45% ($p > 0.05$), and the skin humidity of all positions at 38°C/60% was significantly higher than that of other conditions ($p < 0.01$). As shown in Fig. 8(b) and 8(d), the skin humidity of the lower arm and calf was significantly different among the three different conditions ($p < 0.01$).

Table 1. Results of binary linear regressions between Tsk and Hsk and RMS.

	Unstandardized Coefficients(B)	Standardized Coefficients (B)	t	P
Constant	62.59		4.26	0.000
T _{sk}	-1.96	-0.625	-3.57	0.001
H _{sk}	0.24	0.410	2.34	0.022

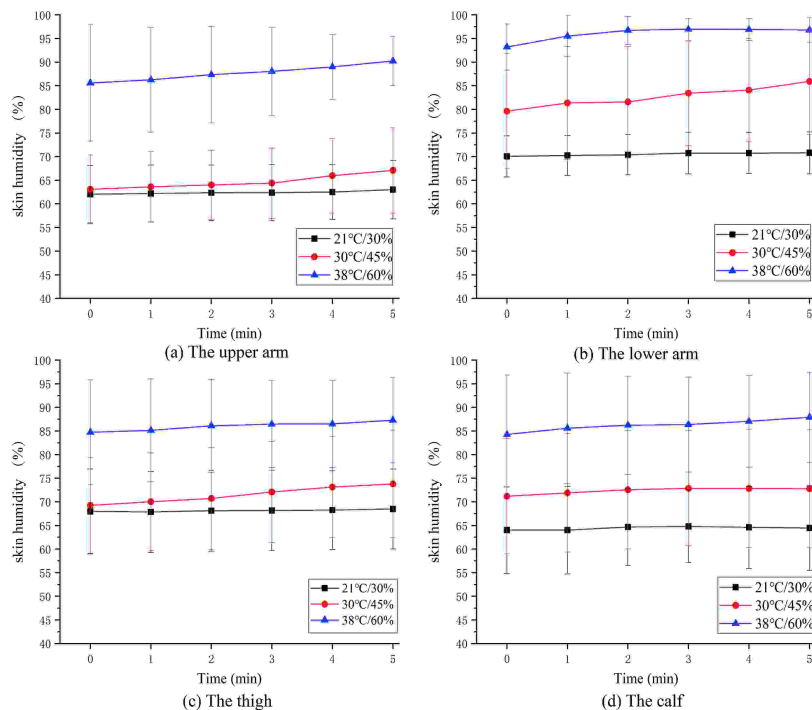


Figure 8: The skin humidity of all positions at different conditions.

This study analyzed the relationship between Tsk, Hsk, and the root means square (RMS) by binary linear regression. The regression model was statistically significant for RMS ($F = 6.55$, $p < 0.003$), the regression coefficients as shown in Table 1, and the goodness of fit was $R^2 = 0.44$, which illustrated that the Tsk and Hsk affected the change of EMG. The effect of skin temperature was greater than the impact of skin humidity.

DISCUSSION

The main objective of this paper is to investigate whether different T_a and RH affect muscle fatigue. The results showed that participants under a higher temperature would reduce the mean power frequency of RF and TA compared with the 21°C/30% condition (Fig. 4), indicating a temperature effect on the EMG signal. Bell et al. evaluated the influence of different air temperatures (10°C, 23°C, and 40°C) on EMG during contractions of the quadriceps muscle; they found the EMG amplitude was reduced at a given force as temperature increased (Bell, 1993); this is consistent with the results of this study. Also, many studies on muscle fatigue showed that fatigue occurs when RMS increases and MPF decreases (Lecocq et al., 2020; Rampichini et al., 2020; Skrzat et al., 2020). Petrofsky et al. studied the isometric contraction of forearm muscles in 10°C, 20°C, 30°C, and 40°C temperature environments, and the results showed that the centre frequency of the EMG power spectra decreased during fatiguing isometric contractions (Petrofsky and Lind, 1980). Above all, muscle fatigue is prone to occur in environments with high temperatures and high relative humidity. The MPF of RF increased at 21°C/30% during this period (Fig. 4(a)) because it has not been fatigued. The MPF of BB and FCR had no significant difference among all conditions (Fig. 5), possibly because they have not yet developed fatigue, which might be related to the smaller exercise intensity of BB and FCR compared with the lower limbs. Also, the subjects could adjust their upper limb working posture slightly during the mission.

In addition, this work also reported the discrepancy of the fatigue level in different body parts when continuously exposed to the 38°C/60% environment (Fig. 6); the fatigue between different body positions is connected to the muscle's labour intensity. Murray et al. studied the pilot's neck and shoulders muscle fatigue and found a significant difference between different muscles (Murray et al., 2016a). Srinivasan et al. researched the fatigue of cyclists' medial biceps brachii, medial trapezius, and so on, also reporting a significant discrepancy between different muscles, and not all muscles were found tired (Srinivasan, 2007), which corresponded with the result of this work. Interestingly, the MPF of RF was lower than TA, BB, and FCR in this work (Fig. 6), which indicated that the fatigue of RF may occur more consequently in this mission. It might suggest that the subjects' legs had to bend during the hold mission to keep a position to control the aircraft pedal, which means the RF cannot fully relax. Moreover, it was speculated that the result was also related to cockpit seat comfort or the subject's sitting position.

The reasons for EMG change in the high temperature and relative humidity environment are critical. During the experiment, the high air temperature and

humidity will cause changes in human skin temperature and skin humidity; the T_{sk} and H_{sk} are higher in the high-temperature and humidity environments than in the 21°C/30% condition (Fig. 7, Fig. 8). Many studies have shown that the high temperature and high humidity environments can lead to the increased skin temperature and skin humidity (Li et al., 2018; Wu et al., 2020), which is consistent with the results of this study. Due to the results above and to further explore the relationship between the pilot's fatigue and the condition, we also analyzed the relationship between skin temperature and humidity with RMS and found that the T_{sk} and H_{sk} have significant effects on EMG signals. Coletta et al. studied the effects of core temperature and skin temperature on neuromuscular response during dynamic muscle contraction, which showed that skin temperature was the primary thermal afferent during a position task requiring dynamic maintenance of joint angle with minimal core temperature influence (Coletta et al., 2018), this was consistent with the results of this work.

Also, many studies have shown that EMG may be related to muscle action potential conduction velocity change. A reduced muscle temperature has been shown to increase the duration of each action potential propagating along the muscle fibres (Buchthal et al., 1954). Lindstrom et al. believed that H^+ , a metabolite produced by local muscles during fatigue, slows down the conduction velocity of the action potential along muscle fibres, resulting in a significant decrease in MPF and MF values (Lindstrom et al., 1970). In addition, EMG might relate to the distribution of fluids within the muscle; more blood and thus fluid is shunted to the periphery to help the sweating response under the hot environment (Chiesa et al., 2016; Kalsi et al., 2017; Wong and Hollowed, 2017). To summarize, skin temperature and skin humidity can also affect flight fatigue.

CONCLUSION

This study aimed to explore the muscle fatigue of volunteers under different cockpit T_a and RH, and the EMG signals, skin temperature, and skin humidity were measured. The main conclusions of this study are as follows:

- (1) The results showed that high cockpit T_a and RH could affect muscle fatigue, and participants under a higher temperature will reduce the MPF of RFC and TA compared with the 21°C/30% condition.
- (2) In addition, it was shown that the fatigue severity of different positions of the subjects is different at 38°C/60% condition, and the RF was prone to show fatigue in this study.
- (3) The skin temperature and humidity significantly affect the changes of EMG signals, and muscle fatigue might be caused by the change of fluid body distribution and action potential conduction velocity along muscle fibre caused by the change of T_a and RH.

This study provided a reference for monitoring the fatigue level of pilots and planning operations, and making the mission more in line with

ergonomics. In the future, fatigue research can also be carried out in combination with long flight times, overload, and different flight difficulties, and more reliable prevention strategies can be put forward.

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