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Effect of individual characteristics on a mathematical model of human thermoregulation

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Abstract

A multi-segmental mathematical model of human thermoregulation was tested for its capability to predict individualized physiological responses. We compared the model predictions obtained for an average person with measured individual responses of subjects exposed to mild cold. Secondly, body composition (BC) data, the resting metabolic rate (MR), and the actual measured MR during the test were used as input into the model.

The data was obtained from 20 subjects (age: 19–36 years; BMI: 17–32 kg/m²). BC, MR, rectal and skin temperatures were measured for 1 h at 22 °C, followed by 3 h at 15 °C.

A mean bias of 1.8 °C, with a standard error of 0.7 °C, resulted for the mean skin temperature of an average person at 15 °C. When subjective BC and measured MR were incorporated the bias was -0.2 ± 0.9 °C. For the hand-back skin temperature the bias \pm standard error fell from 5.3 ± 2.8 °C for an average person to 2.0 ± 2.5 °C, when using individualized characteristics. Trunk skin temperatures were not significantly affected by the adjustments.

In conclusion, this study shows that on a group level predictions of skin temperatures can be improved when adopting individualized body characteristics and measured MR, but the predictions on an individual level were not improved.

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Keywords: Body temperature; Energy expenditure; Body composition

1. Introduction

In daily life humans are frequently exposed to environmental conditions that deviate from thermo-neutral conditions. Disturbances from thermo-neutral conditions can lead to temporal changes in the body heat content and to adjustments of the thermoregulatory system. Even under mild environmental conditions,

individuals may differ in their physiological response (Marken Lichtenbelt et al., 2002; Marken Lichtenbelt et al., 2001). Inter-individual differences in the thermoregulatory responses to severe cold, for instance, have been linked to age, the composition of the body and the sex (Kaciuba-Uscilko and Grucza, 2001; Matsumoto et al., 1999; Van Someren et al., 2002). Under mild cold conditions comparably little information is available. Recent research, however seems to indicate that the body composition (BC) is an important factor (Ooijen et al., 2004).

Since the 1960s various mathematical models have been developed to enlarge our understanding of the

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principles of human thermoregulation (Stolwijk, 1971). Other heat budget models have been used, for example, to predict occupant comfort in buildings equipped with heating and air conditioning systems (Fanger, 1973). A promising potential application for mathematical models of human heat transfer and thermal comfort is in the clinic (e.g. surgery/recovery (Sessler, 2000); accidental hypothermia; pre-terms (Horn et al., 2002)) and in health sciences (differences in metabolic efficiency between subjects groups (Matsumoto et al., 1999)).

Most of the models available today are based on the work of Stolwijk (1971), who modeled the body as a composite of several cylinders representing the head, the corpus, and the upper and lower extremities. Useful refinements of this model have been implemented, among others by Wissler and Huizinga (Huizinga et al., 2001; Wissler, 1985). However, most thermoregulatory models have been postulated on the basis of a limited number of experiments and often the authors have used their own experiments to validate their models. Fiala et al. (1999) have developed a new model based on the analysis of a large number of independent experimental data.

The purpose of this study was to investigate possibilities and potential of the model to also predict inter-individual differences in human body temperature and metabolic responses to cold. Firstly, we compared predictions of the original model for a standard subject with measured individual responses to mild cold. Secondly, the model was adopted to incorporate individualized characteristics (BC data, resting metabolic rate (RMR)) and actual measured metabolic rate (MR) during the test.

2. Methods

2.1. Measurements

2.1.1. Design

The experiments took place at the end of the summer, in August and September. The subjects attended the laboratory for an overnight stay including the following morning to participate in the experiment. The subjects were instructed to perform no exercise the day before the measurement and they were in fasting condition. In the morning, MR, intestinal, rectal and skin temperatures were measured for 1 h at an ambient temperature of 22 °C followed by 3 h during which the subjects were exposed to 15 °C. Relative humidity was 50% and ventilation was 0.05 m/s. The subjects were lying supine on a stretcher. The clothing, with an overall insulation of $I_{cl} = 0.71$ clo ($R_{cl} = 0.109$ m²°C/W), consisted of sweatpants (0.28 clo), a sweater (0.37 clo), socks (0.02 clo) and panties and a bra for women and briefs for men (0.04 clo). In the experiment, the face, hands and ankles were uncovered.

2.1.2. Subjects

Ten male and 10 female subjects between 19 and 36 years of age and BMI ranging from 17 to 32 kg/m² participated in the experiment. Percentage fat was significantly higher ($27 \pm 7\%$) in females compared to males ($16 \pm 8\%$). With respect to thermoregulatory responses and MR, corrected for fat-free mass, there were no significant gender differences. The subjects were non-smokers and were not on medication.

The volunteers were given detailed information regarding the purpose and the methods used in the study, before written consent was obtained. The Ethics Committee of Maastricht University approved the study.

2.1.3. Methods

BC was calculated using the three-compartment model according to Siri (1956), using underwater weighing and deuterium dilution (Westerterp et al., 1995).

During the morning tests, the O₂ consumption and the CO₂ production were measured by indirect calorimetry, using a ventilated hood system. MR was calculated from this data according to Weir (1949). RMR was defined as the MR in a thermo-neutral environment, lying still and awake.

Rectal temperature was measured continuously by a thermistor-probe (YSI probes, series 402, Yellow Springs Instruments Co. Ltd., Ohio, U.S.A.) inserted for 10 cm.

Skin temperatures were measured by surface thermistors (YSI probes, series 409B), at the handback, upper arm, chest at the m. pectoralis, abdomen anterior, back, thigh anterior, and foot instep. Temperatures were recorded continuously for 50 s out of every minute and saved every minute.

2.2. Modeling

The model we used was developed to predict human physiological and perceptual responses in both steady state and transient conditions (Fiala et al., 1999, 2001). The dynamic model of human thermoregulation consists of a passive- and active-system model and predicts body temperatures, regulatory responses and components of the environmental heat loss in cold stress, cool, neutral, warm and hot stress conditions. It consists of a passive heat transfer part and an active thermoregulatory part. The passive system of the model—a multi-segmental (14 cylinders in combination with a sphere for the head), multilayered (4–5 tissue layers per body element) representation of the human body with spatial subdivisions accounts for phenomena of human heat transfer within the body and at its surface. Within the body thermal effects of blood circulation, heat-generation, -conduction and -accumulation are considered. At the

surface the effects of convection, radiation, clothing insulation, skin moisture-evaporation, -diffusion, and -accumulation are taken into account.

The active system simulates the thermoregulatory reactions of the central nervous system in response to changes in the body temperature distribution. The body can respond by extra heat production (shivering, metabolic heat production), sweating, and vasomotion.

The thermoregulatory part of model was developed based on regression analysis using a large number of published experiments to mimic the ‘average’ human thermoregulatory behavior.

The passive system represents a standard male subject with the following characteristics: 73.5 kg body weight, 1.71 m height, 14.4% fat, 1.86 m² skin surface area, 6% wetted skin area ratio, 4.9 L/min cardiac output, and 87.1 W basal MR.

The model requires input data on the thermal environment, the activity level, and the clothing insulation for which the thermal state of the body will be predicted.

2.3. Model measurement comparisons

Firstly, we compared the predictions obtained for an average subject with measured individual thermoregulatory responses to mild cold, using the standard input procedures.

Secondly, we included in the model actual measured MR throughout the cold exposure test, RMR, and/or BC data (i.e. height, weight and percent body fat).

We calculated the differences between predictions of the model with measured results for each individual over 1 min periods. These were used to calculate mean differences and standard deviations (SD). The results are provided as mean \pm SD over 30 min. time intervals, i.e. the last 30 min in comfort (22 °C; 31–60 min) and the last 30 min (211–240 min) in the cold (15 °C; Table 1).

3. Results

Using the standard modeling procedure differences between model and measurement are substantial, i.e. up to 5.3 ± 2.8 °C (handback) during the last 30 min interval (Table 1). As an example, the deviation between predicted and measured mean skin temperature is plotted over time in Fig. 1. Adopting individual characteristics (RMR and BC) and actual MR in the model, improved the predictions of skin temperatures to a notable extent for most body parts. For instance, the improvement was substantial during the last 30 min in the cold for mean skin temperature (from 1.8 to -0.15 °C) and the handback temperature (from 5.26 to 1.98 °C) (Table 1). Also improved predictions of the rectal temperature were obtained although the predictions were already within the measurement error. The SD did not change much. For the skin temperatures the main improvements achieved were due to the combined effect of correction for BC and actual measured MR. The effect of a variable RMR in the model on predicted

Table 1

Mean temperature difference (°C) and standard deviation between model and measurement for mean skin temperature and at four body locations

Time interval (min)	Modeling procedure	Mean skin		Foot anterior		Hand posterior		Abdomen posterior		Rectal	
		difference	SD	difference	SD	difference	SD	difference	SD	difference	SD
31–60	Standard	0.86	0.59	−1.17	1.53	1.62	2.05	0.52	0.75	0.32	0.33
211–240		1.78	0.67	2.63	1.67	5.26	2.76	−0.57	1.18	−0.13	0.43
31–60	RMR input	0.87	0.58	−1.20	1.53	1.68	2.05	0.53	0.75	0.36	0.32
211–240		1.67	0.66	2.48	1.62	5.13	2.78	−0.55	1.19	−0.02	0.37
31–60	MR input	0.14	0.59	−1.86	1.52	1.23	1.97	0.25	0.76	0.60	0.33
211–240		0.61	0.68	1.14	1.66	3.99	2.55	−0.69	1.20	0.62	0.44
31–60	BC input	0.12	0.76	−1.98	1.51	0.87	2.08	−0.10	0.93	−0.17	0.73
211–240		0.86	1.03	1.87	1.63	4.27	2.58	−1.30	1.49	−0.55	0.83
31–60	BC and RMR input	0.12	0.77	−1.93	1.53	0.90	2.09	−0.09	0.92	−0.13	0.72
211–240		0.79	1.03	1.80	1.64	4.16	2.59	−1.25	1.48	−0.43	0.77
31–60	BC and MR input	−0.58	0.75	−2.59	1.49	0.04	2.10	−0.38	0.93	0.08	0.77
211–240		−0.15	0.89	0.62	1.60	1.98	2.54	−1.33	1.40	0.09	0.87

RMR: resting metabolic rate; MR: metabolic rate; BC: body composition; SD: standard deviation.

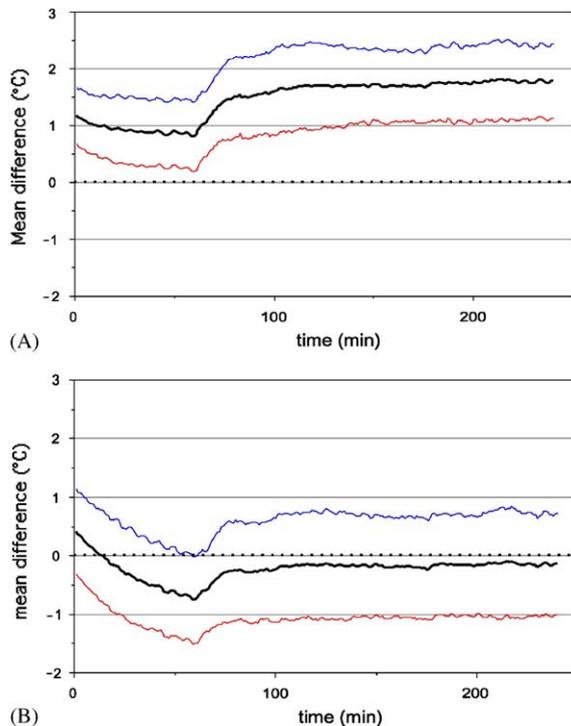


Fig. 1. (A) Mean difference (bold line) with SD (thin line) between modeled and measured skin temperature plotted against time, using the standard subject in the model (B) and with input in the model of subject characteristics and actual measured MR.

temperatures was negligible. The largest improvements resulted from the inclusion of the measured MR throughout the test.

The predicted skin temperature of the trunk were found to be less sensitive changing individual characteristics, as can be seen for the abdomen posterior in Table 1. Results from the thorax anterior and abdomen anterior showed similar results (not provided in here).

4. Discussion

In this study, the Fiala multi-segmental thermoregulatory model was used to predict the average human physiological responses and showed discrepancies to measured responses of individuals exposed to comfortable and mild cold environmental conditions. However, corrections for individual characteristics of healthy subjects showed that the model could be improved substantially on group level (mean deviation). The effect was largest on the exposed body elements, because the variation in temperature is the largest on these parts.

Deviations on an individual level still remain large (large SD).

Improvement of the model was the largest by adopting the actual, measured metabolism throughout the test. This is in itself not surprising since the model gets adapted along the modeling process. However, it indicates the necessity of improving the model with respect to changes in energy metabolism in response to mild cold.

When accurate predictions on an individual level are needed or predictions in the clinic under special thermal conditions (hypothermia, hyperthermia, anaesthesia, etc.) are needed, adaptations of the model are likely to be necessary. Here, a model with more physiological background could be used in place of the regression model implemented in the active system part of the model. The target for future research is beside a correction for individual characteristics, also integration of physiological based control-mechanisms in the model.

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