Evaluation of the metabolic rate based on the recording of the heart rate

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Received October 13, 2016 and accepted February 22, 2017
Published online in J-STAGE February 28, 2017

Abstract: The assessment of harsh working conditions requires a correct evaluation of the metabolic rate. This paper revises the basis described in the ISO 8996 standard for the evaluation of the metabolic rate at a work station from the recording of the heart rate of a worker during a representative period of time. From a review of the literature, formulas different from those given in the standard are proposed to estimate the maximum working capacity, the maximum heart rate, the heart rate and the metabolic rate at rest and the relation (HR vs. M) at the basis of the estimation of the equivalent metabolic rate, as a function of the age, height and weight of the person. A Monte Carlo simulation is used to determine, from the approximations of these parameters and formulas, the imprecision of the estimated equivalent metabolic rate. The results show that the standard deviation of this estimate varies from 10 to 15%.

Key words: Accuracy, Ergonomics, Workload, Metabolic rate, Heart rate, Thermal stress

Introduction

Work physiology was a subject of intense research during the years 1960 – 1980, but then disappeared almost from the publications and congresses in favour of ‘modern’ subjects such as musculoskeletal disorders1) and the psychosocial factors2) during the years ’90. While it is true that, in the countries said to be developed, the working conditions changed a lot, it is obviously not the case universally as demonstrated by the statistics of fatal industrial accidents reported by Takala3). These ‘modern’ subjects are indeed essential and concerns about the psychosocial work environment constitute a significant evolution in Occupational Health from merely the absence of impairments and diseases, towards wellbeing. However, it would be an awful error, in the so called developed countries, but especially in the developing countries, to consider that the common problems of industrial hygiene are once for all resolved.

The use of the health and safety standards of the countries known as ‘developed’ in other countries raises problem in general, but it is particularly true regarding work physiology and performance in hot conditions. It is remarkable that all the ISO standards concerning the thermal environments were developed based on studies conducted exclusively in developed countries and it can be questioned whether they are really applicable for populations with particular characteristics of morphology, food and living conditions4).

All these standards start from the heat balance equation which indicates that the heat produced in the body—the metabolism—has to be evacuated from that body to maintain it at a constant temperature. The ISO standard on metabolic rate (ISO 8996)5) concerns the main part of this heat
balance, the metabolic rate. Errors on the evaluation of the metabolic rate will obviously result in errors in the evaluation of the comfort-discomfort and the predicted heat stress or strain.

ISO Standard 8996 was first published in 1990, mainly based on the work by Spitzer, Hettinger and Kaminsky published in 1982, itself based on data collected in the years 1960 to 1975 essentially in Germany. It was deeply revised in 2004 regarding its structure, but still based on the same old data. It is now in revision again in order to update the information and, in particular, to make it more applicable to any population, instead of to the workers populations of the Western countries implicitly considered in the previous versions. The standard presents 4 levels of methods to estimate the metabolic rate.

At the level 1, two simple methods are presented to roughly characterize the mean workload for a given occupation or for a given activity. The first one is a classification according to the kind of activity and is used as such in several standards, such as the WBGT standard (ISO 7243). The second method is giving average metabolic rate for several occupations: as the nature and the strenuousness of the work of blast furnace workers, machine moulders, but also butchers, gardeners or secretaries has changed, sometimes considerably, in the last decades, the corresponding average metabolic rates are no longer valid and, as new data are not available, this second method has to be withdrawn.

At level 2, a procedure is described to recognize the different activities of a given worker during a representative period of time, to estimate the average metabolic rate for each of them, to record the sequence of activities with time, and compute the time-weighted average metabolic rate. This procedure may lead to very large errors depending upon the complexity of the job, the knowledge of the working conditions by the observer and his ability to recognize the different activities and evaluate their corresponding metabolic rate.

The method of Level 3 of the standard is the estimation of the metabolic rate from recordings of heart rate.

The general formula is:

\[ M = \frac{(\text{MWC} - M_0)}{(HR_{\text{max}} - HR_0)}(HR_{wm} - HR_0) + M_0 \]  

(1)

Where

MWC is the maximal work capacity, in watts per kg of body weight or in watts;
M_0 is the resting metabolic rate, in watts per kg or in watts;
HR_{max} is the maximum heart rate, in beats per minute (bpm);
HR_0 is the heart rate at the rest, in bpm;
HR_{wm} is the average heart rate observed during the observed period of time, in bpm;
M is the corresponding metabolic rate, in watts per kg or in watts.

As heart rate recorders are presently very popular and cheap, this method has become the least bad method to estimate routinely the metabolic rate.

The formulas to estimate MWC and HR_{max} in the 2004 edition of the standard were those derived by Gillet in a study of 60 Belgian steel workers in 1982. As this sample may not be considered a priori representative of the population in all parts of the world, a review of the scientific literature will be done in order to determine the best formulas for the estimation (with related precisions) of the basic parameters: MWC, M_0, HR_{max} and HR_0.

In addition, the standard indicates also that the precision of this method would be approximately 10%. The reference of this value is unknown as well as what it really means. This is an important issue as this greatly influences the precision of the evaluation of comfort and stress indices. This also needed to be reanalysed and will be done using a Monte Carlo simulation.

Finally, a revised version of the method of evaluation of the metabolic rate from a recording of HR at the workplace will be proposed.

**Evaluation and Precision of the Basic Parameters**

**Evaluation and precision of the maximal work capacity MWC, in watts per kg of body weight**

The maximum capacity of work (MWC) is the expression in watts of the maximum oxygen consumption (VO_{2max}) which is the maximum quantity of oxygen per unit of time that a person can consume under maximum conditions of her/his cardiovascular possibilities.

This VO_{2max} quantity, and consequently the MWC, can be evaluated by means of a cardiac stress test where the subject is invited to produce an increasing effort, in general on an ergonomic bicycle or treadmill, until reaching exhaustion. Such cardiac stress tests raise health risks and can only be performed under strict medical surveillance. Therefore they cannot be carried out in the large majority of field studies and it is necessary to fall back on submaximal effort tests, even on formulas of prediction according to the characteristics of the subject.
Malchaire and Mairiaux\textsuperscript{11} compared the results of various methods of indirect evaluation with the values recorded during full cardiac stress tests and showed the progressive reduction of the correlation coefficient (R) as and when the method deviates from the reference stress test. However, the various methods returned individual variations ($\pm$ standard deviation SD) relatively concordant of about 12.5%.

Very many studies\textsuperscript{8, 12–17} sought to determine the relationship between the MWC (in watts) and individual characteristics. Nearly all adopted a relation depending upon the age, $A$, and the weight, $W_b$, with the following algebraic structure:

$$\text{MWC} = (b - a \times A) \times W_b$$

(2)

where $a$ and $b$ are the intercept and the slope of the linear regression, respectively.

Table 1 summarizes the formulas reported in seven significant studies published in the last 40 yr.

| Study                  | Characteristics | Men          | Precision | Women         | Precision |
|------------------------|-----------------|--------------|-----------|---------------|-----------|
| Bugajska et al.\textsuperscript{12} | —               | 21.40 0.18   | SD=3.7    | 19.50 0.18    | SD=3.1    |
| Fitzgerald et al.\textsuperscript{13} | Active          | — —         | —         | — — —         | —         |
|                         | Sedentary       | — —         | —         | — — —         | —         |
| Tanaka et al.\textsuperscript{14} | Sedentary       | 17.38 0.097  | —         | 19.50 0.20    | R=0.8     |
| Dehn and Bruce\textsuperscript{15} | Sedentary       | 19.69 0.14   | —         | — — —         | —         |
| Wilson and Tanaka\textsuperscript{16} | Active         | 18.86 0.14   | —         | — — —         | —         |
| Gillet Y.\textsuperscript{8}           | —               | 18.00 0.10   | —         | 14.50 0.10    | —         |
| Mean values            |                 | 19.45 0.133  |           | 17.51 0.15    |           |

Evaluation and precision of the maximal work capacity in watts

Formulas 3 and 4 allow estimating the MWC in W/kg. The derivation of the metabolic rate from heart rate requires the knowledge of the MWC in watts. Thus, it remains to determine the weight to take into account.

The majority of the studies reported in table 1 mentioned that each subject took a medical examination, sometimes with ECG, but they did not indicate whether a selection was really carried out and on what bases. One study only\textsuperscript{14} mentioned the exclusion of subjects with a body mass index BMI = $W_b / H_b^2$ greater than 35 kg/m\textsuperscript{2}. This means that, in most cases, the actual weight of the person was used as input value in their correlation studies and, consequently, that the MWC can be estimated from the actual weight and not from a ‘lean’ weight as recommended\textsuperscript{18}. However, the age and weight of the experimental subjects suggest that they were, as very often, students, who usually are not (yet) overweight and therefore are not representative of the general population. Then, the knowledge of the ‘ideal’ weight $W_{bid}$ of the subject should make it possible for the observer to judge whether the actual weight can be validly used to evaluate the MWC.

Formulas for estimating the ‘ideal’ weight were proposed by Creff\textsuperscript{19} (as quoted in Pai and Paloucek\textsuperscript{20}) seek-
ing to take account of the morphology of the subject:
  • for ‘normal’ morphology:
    \[ W_{\text{bid,n}} = 0.9 \times (H_b + A/10 - 100) \]  (5)
  • for ‘slender’ morphology: \[ W_{\text{bid}} = W_{\text{bid,n}} \times 0.9 \]  (6)
  • for ‘broad’ morphology: \[ W_{\text{bid}} = W_{\text{bid,n}} \times 1.1 \]  (7)

The formula for ‘normal’ morphology gives ‘ideal’ weight somewhat greater than the formula proposed by Lorentz in 1928 (see de Saint Pol21):

  • for men: \[ W_{\text{bid,m}} = 0.75 \times H_b - 62.5 \]  (8)
  • for women: \[ W_{\text{bid,w}} = 10 + 0.8 \times W_{\text{bid,m}} \]  (9)

It is proposed to adopt the more recent Creff’s formula, while adopting the reduction for women of equation 9.

However, the use of these formulas rests upon the distinction between the persons ‘normal’, ‘broad’ and ‘slender’. As suggested by Monerot-Dumaine22, the morphology class can be determined on the basis of the size of the wrist, which is a good indicator of skeletal mass and frame size. According to the most recent anthropometric
The basal metabolic rate (M_b) is defined as the minimal energy rate expenditure to sustain the functioning of the vital organs when the subject is at complete rest, that is, 12 h after eating, after a restful sleep, lying and in a state of complete mental and physical relaxation. The many studies about M_b expressed it in watts and showed that it increases with the size and body mass of the subject and decreases with age. Prediction formulas abound, the most well-known being those proposed by Harris and Benedict:

- for men: $M_{b,m} = 3.99 + 0.0341 \times W_b + 0.0397 \times H_b - 0.0765 \times A$ (10)
- for women: $M_{b,w} = 3.84 + 0.0298 \times W_b + 0.0366 \times H_b - 0.0703 \times A$ (11)

At present, the formulas most generally quoted are those of Mifflin et al.:

- for men: $M_{b,m} = 1.255 \times W_b^{0.48} \times H_b^{0.5} \times A^{-0.13}$ (14)
- for women: $M_{b,w} = M_{b,m} \times 0.888$ (15)

In the field of the ergonomics of thermal environments, heat exchange being done primarily by convection, radiation and evaporation on the surface of the skin, calculations are carried out per unit of body surface area, i.e. in W/m². The body surface area is given by the formula of Dubois and Dubois:

$$A_b = 0.007184 \times W_b^{0.425} \times H_b^{0.725}$$ (16)

Table 2 gives the minimal, maximum and average values as well as the standard deviations and coefficients of variation of the basal metabolisms in W and W/m², evaluated by formulas 12 and 14 above for men with body masses from 50 to 100 kg, heights from 150 to 190 cm and ages from 20 to 60 yr. Were eliminated the unusual combinations such as 50 kg and more than 170 cm or 100 kg and less than 160 cm.

The differences in basal metabolic rate are very marked between a minimum (for a subject young (20 yr), tall (180 cm) and heavy (100 kg)) and a maximum (for a person older (60 yr), smaller (150 cm) and lighter (50 kg). In absolute value, M_b in watts varies almost by a factor of 2. On the other hand, brought back to the body surface area, it varies relatively little: the standard deviation is reduced by a factor of about 5 and the coefficient of variation, reduced by about a factor of 2, becomes approximately 5%.

In practice, the basal metabolic rate may thus be regarded as a constant when expressed in W/m² and the most acceptable value seems to be the average of the mean values obtained by the two formulas selected above, that is, 43 W/m² with a standard deviation of 2.2 W/m². The difference of 3 to 5.6 W/m² with the minimum and maximum values reported in Table 2 will not lead to very significant differences when one will calculate the PMV-PPD indices or the duration limits of exposure according to the Predicted Heat Strain (PHS) approach for hot working conditions or also the Required Clothing Insulation (IREQ) approach in case of cold working conditions. This value is quite close to the figure of 46 W/m² given for a "reclining" person in the ISO 7730 standard.

Table 2 reports the same statistics of the basal metabolisms in W/m², evaluated by formulas (13) and (15) for women and makes it possible to conclude that the basal metabolic rate for women is on average of the order of 38 ± 2.1 W/m², that is some 5 W/m² lower than for men.

The basal metabolic rate (M_b or BMR) is to be distinguished from the resting metabolic rate (RMR), which is
the energy expenditure of a subject at rest in usual conditions.

The conditions of this definition are however not as rigorous as for the basal metabolism, so that an accurate estimate does not appear possible. RMR is greater than BMR “due to increases in energy expenditure caused by recent food intake or by the delayed effect of recently completed physical activity” \(^{(31)}\). These authors estimate this increase to be equal to 10 to 20\%. In their study with 6 male subjects 20 years old, of mean height of 175 cm and mean weight of 70 kg (1.86 m\(^2\) in body surface area) Garg et al.\(^{(32)}\) reported metabolic values, in watts, on average equal to 1.60 and 1.67 times the body mass respectively when seated and upright, that is 112 W and 117 W respectively for a subject of 70 kg, or 60 and 63 W/m\(^2\) by taking account of the body dimensions of the studied subjects. The resting metabolic rate would correspond consequently to approximately 1.4 times the basal metabolism. This value corresponds to what is given in the report of the World Health Organization \(^{(33)}\): \(M_0 = 1.5 \, M_b\) and somewhat higher than the often cited value of 105 watts for a man and 95 watts for a woman, in particular reported by Spitzer et al.\(^{(6)}\). One can thus conclude that the resting metabolic rate can be estimated equal to 60 W/m\(^2\) for men and to 53 W/m\(^2\) for women.

As the conditions of evaluation of the metabolic rate ‘at rest’ are not standardized, its imprecision is higher than that considered for the basal metabolism. Garg et al.\(^{(32)}\) reported standard deviations of about 12\% of the resting metabolic rate, so that it appears logical to admit an imprecision (standard deviation \(SD_{M_0}\)) of 60 \(\times\) 0.12 \(\approx\) 7 W/m\(^2\) for both women and men.

### Evaluation and precision of the maximum heart rate, \(HR_{\text{max}}\)

It is usually considered that the maximum heart rate decreases with age according to \((220 – A)\). Robergs and Landwehr\(^{(34)}\) published an article entitled: ‘The surprising history of the “\(HR_{\text{max}} = 220\text{-age}\)” equation’ where they re-examine 38 univariate formulas (function of age only) of prediction of \(HR_{\text{max}}\) proposed during the last 80 yr. All these formulas strongly approach the formula \((208 – 0.7 \times A)\) and do not differ significantly from it considering the low to very low correlation coefficients obtained. This study appears definitive and it seems useless to return to the background documents. The conclusions of the authors are however debatable:

1. ‘The most precise expression is that of Inbar et al.\(^{(35)}\): \(HR_{\text{max}} = 205.8 – 0.685 \times A\). However the estimation error is very large: \(SD = 6.4 \text{ bpm}\). It is true that this expression is based on a very large study with 1,424 subjects, and gives a correlation coefficient of 0.67. However a study quite as large\(^{(36)}\) led to the expression \((207 – 0.64 \times A)\) with a correlation coefficient definitely lower \((R = 0.42)\). The fact that the Inbar correlation coefficient is greater is likely due to the fact that the studied group was more homogeneous as for the other factors unknown to date that determine this \(HR_{\text{max}}\). In no case, it can be alleged on this basis that the expression is more accurate. The differences between \(HR_{\text{max}}\) estimated by the Inbar formula and the general formula \((208 – 0.7 \times A)\) being lower than 2 bpm for ages higher than 20 yr, this general formula, which does not give the illusion of a high degree of precision, will be adopted.

2. ‘Additional research is necessary to develop multiple regressions for various populations and various modes of exercises.’ It is rather remarkable to observe from the
Robergs and Landwehr review\textsuperscript{34}, that no statistically significant difference was noted for 80 yr between men and women, between sedentary, active and trained subjects, between Hispanic and Caucasian subjects, between subjects in good health and less good health (among whom hypertensive, but not those with cardiac diseases). In addition, the only multivariate models\textsuperscript{37} explained at best 86\% of the total variance instead of 72\% for the simple linear regression. This increase hardly appears important in practice and, the results being considerably function of the studied group and not very reproducible, it cannot be asserted that better general multivariate models will ever be developed.

We will conclude from this review of the literature that HR\textsubscript{max} can be predicted by the simple relation:

\[ \text{HR}_{\text{max}} = 208 - 0.7 \times A \]  \hspace{1cm} (17)

but that the imprecision of the prediction is considerable: \( \text{SD}_{\text{HR}_{\text{max}}} = 11 \text{ bpm} \)

\textit{Evaluation and precision of the heart rate at rest, \text{HR}_0} \\

The heart rate of rest \text{HR}_0 is difficult to define accurately\textsuperscript{39}. When a calibration cardiac stress test was carried out, the heart rate to consider is that corresponding to the resting metabolic rate. In cases where the subject had, at the low levels, an important elevation due to stress or mental load, this value is determined by extrapolation of the (M vs. HR) relation noted on the levels of high efforts. In the majority of cases however, as said, a cardiac stress test is not carried out and the heart rate at rest must be estimated directly. Various values can be selected:

- An average value such as 70 bpm in all cases: however it is obvious that \text{HR}_0 varies greatly between and within individuals. As discussed below (Fig. 2), this would lead to large under or over estimation of the metabolic rate when \text{HR}_0 is respectively larger or smaller than this value.
- The HR observed at rest, sitting, at the beginning of the recording: however Malchaire \textit{et al.}\textsuperscript{40} showed that this value is systematically higher than the values discussed hereafter, this elevation being due to the state of nervousness of the subjects little accustomed to these recordings. This led Meyer \textit{et al.}\textsuperscript{39} to recommend that be organized a pause sitting without speaking during at least 5 min during any HR recording at the work station.
- The minimal HR observed during work: this value can be completely occasional and influenced by errors of measurement or recording.
- The HR exceeded during 99\% of the working time (\text{HR}_{99}) as suggested by Malchaire \textit{et al.}\textsuperscript{17, 40}, i.e. the value below which the HR is during approximately 5 min over the 8 work h. This value is less influenced by measurement errors and will generally be close to that observed on average during the rest period recommended by Meyer \textit{et al.}\textsuperscript{39}, or that recorded during the

![Fig. 2. Comparison of the (M vs. HR) relationships on 2 hypothetical occasions for the same subject.](image-url)
meal pauses during the day. It remains to the observer to check that possible HR increases of thermal origin are negligible or are taken into account.

- The HR exceeded during 90% of the time $HR_{90}$ suggested by Gaudemaris et al.\textsuperscript{38}, i.e. below which the HR is during approximately 48 min over the 8 work h. This value will be much more influenced by the nature of work than $HR_{90}$.

$HR_{90}$ thus seems the most logical choice.

This choice of $HR_{0}$ independently of the MWC poses problem when the same subject is recorded on several occasions in the interval of a few days and that the $HR_{99}$ are strongly different. In this case, the computed relations ($M$ vs. HR) are different as illustrated hypothetically in Fig. 2 and the same $HR_{0,wm}$, for example 120 bpm, will correspond to different metabolic rates: in the example: 300 and 450 W.

This appears acceptable, a rise in HR from 70 to 120 bpm being logically due to a greater metabolic rate (450 W) than a rise from 100 to 120 bpm in the second work condition. The interpretation using the (M vs. HR) relationship derived from a cardiac stress test, as an example relation 2, would have given in both cases the same value for the metabolic rate of work, 450 W, and the increases from 70 to 120 bpm and from 100 to 120 bpm during the 2 observations would have been interpreted as due to the same metabolic rate. It should thus be concluded that the use of the $HR_{99}$ drawn from the recording to be analysed is preferable to any other $HR_{0}$ value.

It remains to determine at which metabolic rate this $HR_{99}$ has to be associated for the calculation of the (HR vs. M) relationship. If the recommendation of Meyer et al.\textsuperscript{39} was followed, the corresponding metabolic rate can be taken equal to the resting metabolic rate discussed previously, that is to 60 W/m\textsuperscript{2} for men and 53 W/m\textsuperscript{2} for women, with a standard deviation $SD_{M0}$ of 7 W/m\textsuperscript{2}. These values are translated into watts by multiplying by the body surface of the subject. In all other cases, it is up to the observer to appreciate the corresponding metabolic rate and its uncertainty.

$Evaluation and precision of the average heart rate at work, HR_{0,wm}$

As discussed in the above section, the MWC is ideally evaluated during a cardiac stress test on a bicycle or a treadmill where the efforts are purely dynamic. In industrial situations, such dynamic efforts are primarily related to displacements and alternating movements of the limbs allowing blood circulation. In most cases however, the worker has to carry out static efforts with the muscles contracted without movements: load lifting, pushing, pulling, etc. In these cases, the cardiovascular constraint is definitely higher: HR increases greater than that related to the oxygen uptake increase and increases not only in the systolic pressure, but also in the diastolic pressure. As an example, Gálvez et al.\textsuperscript{41} reported HR elevations of about 20 and 38 bpm in the case of gripping efforts equal to 20% and 50% of the maximum voluntary force. In industrial situation, it is impossible to estimate this HR increase of isometric origin, considering the difficulty of quantifying these isometric efforts and the great inter-individual variability ($SD = 6$ bpm) under the controlled conditions of the study of Gálvez et al.\textsuperscript{41}. The heart rate is also raised in association of an increase in core temperature in case of thermal strain. This increase is estimated to be in average equal to 33 bpm per degree of increase of the central temperature\textsuperscript{42}. Again, this correspondence is very variable, from 21 to 46 bpm/°C. The HR is also raised by other factors such as stress, unexpected events, fear etc. Finally it varies according to the circadian rhythm, with again major inter-individual differences\textsuperscript{43}. The heart rate at a given time can thus be regarded as being:

$$HR = HR_M + \Theta$$

where:

- $HR_M = HR_0 + \Delta HR_M$ is the component in relation to the energy expenditure through dynamic efforts;
- $\Theta = \Delta HR_s + \Delta HR_{th} + \Delta HR_N + \Delta HR_e$ the component in relation to the other factors with:
  - $HR_0 = \text{the HR at rest, under neutral thermal conditions}$;
  - $\Delta HR_M = \text{the HR increase due to the dynamic muscular load, under neutral thermal conditions}$;
  - $\Delta HR_s = \text{the HR increase due to static muscular work}$;
  - $\Delta HR_{th} = \text{the HR increase associated with the increase in core temperature}$;
  - $\Delta HR_N = \text{the HR increase associated to mental effects}$;
  - $\Delta HR_e = \text{the residual component of the instantaneous heart rate}$.

In practice, it is not possible to estimate the component $\Theta$, so that it involves an over-estimation of the $HR_{0,wm}$ and consequently of the rate of energy expenditure. This estimation is particularly difficult to do as the HR increases are not simply additive, but often multiplicative. In order to recognize this over-estimate, Malchaire et al.\textsuperscript{40} proposed to qualify the estimated metabolic rate of ‘equivalent’ $M_{eq}$, and to define it as “the metabolic rate which, during a purely dynamic test, would have been associated
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...to the actual $HR_{wm}$ value”. $M_{eq}$ is thus an overestimation of the actual metabolic rate, it is a better estimate of the painfulness of the job performed.$^{40}$

The last question relates to the relevance of the $(M \text{ vs. } HR)$ relation directly or indirectly derived from a cardiac stress test using the great muscular group of the legs, in the case of a working activity carried out with the upper limbs. Studies showed that the VO$_{2\text{max}}$ during manual crank efforts was 23%$^{44}$ to 30%$^{45}$ lower than that measured for the same HR value during a cardiac stress test on bicycle or treadmill. So, as an example in Fig. 3, the $(M \text{ vs. } HR)$ relation derived from the cardiac stress test would be line 2 ($M_{\text{WC legs}} = 900 \text{ W, } HR_{\text{max}} = 182 \text{ bpm}$), while it could be line 1 in case of efforts done primarily with the arms ($M_{\text{WC arms}} = 900 \times 0.7 = 630 \text{ W, } HR_{\text{max}} = 182 \text{ bpm}$). It results from it that, again, the equivalent metabolic rate will be an over-estimation of the real energy expenditure: a $HR_{wm}$ of 120 bpm should correspond to 350 W, but will lead to $M_{eq} = 450 \text{ W}$.

**Precision of the Estimate of the Equivalent Metabolic Rate**

*The Monte Carlo simulation method*

As described by Mahadevan$^{46}$, a Monte Carlo simulation ‘is a numerical experimentation technique to obtain statistics of the output variables of a system computational model, given the statistics of the input variables’.

First a combination of values of age $A$, height $H_b$, weight $W_b$, HR at rest $HR_0$ and average HR at work $HR_{wm}$ is selected. Then the equivalent metabolic rate is computed according to the following procedure:

1. to draw at random 4 values in a Gauss normal distribution: $t_1$, $t_2$, $t_3$, $t_4$.

2. from the values of $A$, $H_b$, $W_b$, to evaluate the parameters $M_{\text{WC}}$ (in W/kg), $M_0$ (in W) and $HR_{\text{max}}$ and their respective standard deviations $SD_{M_{\text{WC}}}$, $SD_{M_0}$, $SD_{HR_{\text{max}}}$.

3. to compute the random values of the 4 parameters by:
   - $W_{br} = W_b + t_1 \times 2.5$
   - $M_{\text{WC}}r = (M_{\text{WC}} + t_2 \times 0.125 \times M_{\text{WC}}) \times W_{br}$
   - $M_0r = M_0 + t_3 \times SD_{M_0} \times A_b$
   - $HR_{\text{max}}r = HR_{\text{max}} + t_4 \times SD_{HR_{\text{max}}}$

4. to compute the $(M \text{ vs. } HR)$ relation from the estimated $M_{\text{WC}r}$, $M_0r$, $HR_{\text{max}r}$ and $HR_0$.

5. to compute the equivalent metabolic rate corresponding to 4 values of mean heart rate $HR_{wm}$ (90, 110, 130, 150 bpm).

This procedure was repeated for 100 values of $t_1$, $t_2$, $t_3$ and $t_4$ and the average and standard deviation of the 100 million of $M_{eq}$ estimates were computed.

The procedure was repeated for 3 values of each of the primary parameters, chosen to cover the common range (except the extremes) of age (25, 40 and 55 yr), of height (160, 175 and 190 cm), of weight (60, 75 and 90 kg) and...
of resting HR (65, 75 and 85). The whole process resulted therefore in 324 values of metabolic rate and corresponding standard deviations.

Figure 4 illustrates the relation between the standard deviation and the equivalent metabolic rate in these 324 combinations. The standard deviation varies linearly as a function of the metabolic rate according to the following expression:

$$\text{SD} = 0.175 \times M_{eq} - 15.0$$  \hspace{1cm} (19)

the correlation coefficient being very high and equal to 0.995. Table 3 gives the coefficients de variation of $M_{eq}$ for values in the range 100 to 700 watts. This result confirms the information given in the standard ISO 8996 of a precision of ± 10% for metabolic rates around 200 watts (light work) but the imprecision is greater and reaches ± 15% for high $M_{eq}$ values. That means however that for subject of MWC = 1,000 W, the confidence interval (C.I.) at 95% of a $M_{eq}$ is rather considerable: thus:

- for $M_{eq} = 250$ W: $\text{C.I.} = [195 ; 305]$
- for $M_{eq} = 500$ W: $\text{C.I.} = [355 ; 645]$

Revised Procedure for the Estimation of the Average Metabolic Rate from a Recording of the Heart Rate at a Work Station

The results of the study make it possible to modify the procedure of analysis of the recordings of HR at a work station described in ISO 8996.

The modified procedure will be illustrated using the HR recording during one day’s work (8 h) in the summer season for a male subject 34 years old, 81 kg and 170 cm, working in a brickyard\(^9\) (Fig. 5). HR was recorded during 448 min and it can be assumed that this sample is representative of a normal work day of 480 min. The average heart rate during the 7 h 28 min of observation was equal to $HR_{wm} = 102$ bpm. The work involved some static work: its effect is impossible to estimate and the concept of ‘equivalent’ metabolic rate is in this case particularly justified. On the contrary, the HR recording did not show any overall trend of elevation of HR and therefore the thermal effect can be neglected.

The subject never smoked and did not play any sport. His wrist breadth was 7 cm, which classifies him in the ‘broad’ morphological group.

His body mass index is: $\text{BMI} = W_b / H_b^2 = 28.0$ kg/m\(^2\) and his ‘ideal’ weight is estimated using Creff’s formula equal to: $1.1 \times 0.9 \times (H_b + A / 10 - 100) = 72.7$ kg. The subject appears to be a little overweight so his ‘ideal’ weight

![Fig. 4. Standard deviations of the equivalent metabolic rate as a function of this $M_{eq}$ obtained through Monte Carlo simulations in 216 combinations of age, weight, height, resting heart rate and average heart rate at work.](image-url)
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will be used for the evaluation of his maximum work capacity.

It is possible to estimate successively:
- the MWC:
  \[ \text{MWC} = (19.45 - 0.133 \times A) \times \text{W}_b = 1,085 \text{ W} \]
- the maximum heart rate:
  \[ \text{HR}_{\text{max}} = 208 - 0.7 \times A = 184 \text{ bpm} \]
- the body surface:
  \[ A_b = 0.007184 \times \text{W}^{0.425} \times \text{H}_b^{0.725} = 2.06 \text{ m}^2 \]
- the resting metabolic rate:
  \[ M_0 = 60 \times A_b = 124 \text{ W} \]

And, as the HR exceeded during 99% of time was equal to 76 bpm.
- the slope of the (M vs. HR) relation:
  \[ a = (\text{MWC} - M_0) / (\text{HR}_{\text{max}} - \text{HR}_{99}) = 8.92 \]
- the intersection:
  \[ b = M_0 - \text{HR}_{99} \times a = -620 \]
- the equivalent metabolic rate:
  \[ M_{\text{eq}} = a \times \text{HR}_{99} + b = 352 \text{ W} \]
- the precision of this estimate:
  \[ \text{SD} = 0.175 \times M_{\text{eq}} - 15.0 = 47 \text{ W} \]

**Discussion**

The first uncertainty in the evaluation of the work load in a work situation comes from the representativeness of the period of time during which the observation is made. The representativeness of a day shift might be illusory as, in some work situations, the tasks are varying from one day to another depending, as examples, on the nature of the work, the number of workers and the fluctuations in production. When the observed period of observation is poorly representative of the overall exposure, the conclusions are simply questionable from the start.

If the observation period was representative in the example given above, \( M_{\text{eq}} = 350 \text{ watts} \) must be considered as the best estimate of the metabolic rate in the observed work situation, not only for the worker, but also for his colleagues and it should therefore be concluded that the average workload is ‘heavy’ in absolute according to the classification adopted at stage 1, *Screening*, of ISO 8996 Standard and for the WBGT index\(^7,47\). For the observed subject with a MWC of 1,085 watts, it is indeed heavy in relative terms (32% of MWC) and marginally compatible with an 8-h work period in continuous. For another subject with a MWC of 800 watts, this \( M_{\text{eq}} \) would represent a ‘very heavy’ work (47.5% of the MWC) and be unacceptable at short term. In order to be sure at 95% to protect the exposed workers, the metabolic rate to consider should not be this mean value but the mean plus 2 standard deviations, that is, in the present case, 450 watts. With this assumption, the working conditions should be considered
It must be finally stressed how complex is the estimation of the energy requirement at a work station, how difficult it is to identify a representative observation period, how numerous are the assumptions to be made concerning the choice of the observed worker, the resting metabolic rate and heart rate, as well as the body weight to take into account, how important can be the influence of the isotopic efforts, the mental load, even the stress caused by the observation. The confidence interval of the final result, $M_{eq}$, might therefore be much greater than $\pm 2$ standard deviations and be simply so large that the evaluation is not only meaningless but unfortunately totally misleading, if the interpretation is not based on observations on several people and in several occasions: the modern equipment for recording heart rate makes this easy and affordable.

All the estimations illustrated in the section above can easily be done with a simple computer program, or with an app for smartphones or tablets. Such a program or app can however be easily misused and it is hope that it will only be used by trained people mastering completely the complexity of the evaluation and observing scrupulously the recommendations.

ISO 8996 describes at level 2, Observation, a time and motion study where the observer must determine as a function of time the sequence of activities, assign a metabolic rate value to each of these activities and compute the time weighted average of these metabolic values. With this method, the errors come from: 1) a lack of representativeness of the observation period (usually shorter than when recording the heart rate); 2) the accuracy of the time study and the validity of the definition of the activities and of the corresponding metabolic rate values; 3) the accuracy of these metabolic values themselves. ISO 8996 proposes to estimate these metabolic rates as a function of the work intensity and the body segments with which it is performed. Our experience with students has shown very large differences between observers in the recognition of the work intensities (defined in objective terms) and the body segments involved. The ISO standard claims that this method provides more reliable results than other methods that can be use in practice in the field, provided that this method provides more reliable results than other methods that can be use in practice in the field, provided that it is carried out by people mastering the complexity of the underlying physiological concepts.

**Symbols**

| Symbol | Description |
|--------|-------------|
| A | Age (yr) |
| a | Slope of a linear relationship (W/(kg·yr)) |
| $A_0$ | Body surface area (m²) |
| b | Intercept of a linear relationship (W/kg) |
| BMI | Body mass index (kg/m²) |
| CV | Coefficient of variation |
| $H_0$ | Height of the subject (cm) |
| $HR_{0}$ | Heart rate at rest (bpm) |
| $HR_{90}$ | HR value exceeded during 90% of the duration of the HR recording (bpm) |
| $HR_{99}$ | HR value exceeded during 99% of the duration of the HR recording (bpm) |
| $HR_{M}$ | HR value in case of purely dynamic efforts (bpm) |
| $HR_{max}$ | Maximum heart rate (bpm) |
| $HR_{ave}$ | Average heart rate at work during the observation period (bpm) |
| $M_0$ | Metabolic rate at rest (W or W/m²) |
| $M_{b}$ or BMR | Basal metabolic rate (W or W/m²) |
| $M_{eq}$ | Equivalent metabolic rate (W) |
| MWC | Maximum working capacity (W) |
| R | Correlation coefficient |
| SD | Standard deviation |
| $SD_{HRmax}$ | Standard deviation of $HR_{max}$ (bpm) |
| $SD_{M0}$ | Standard deviation of $M_0$ (W or W/m²) |

**Conclusions**

The present study was aimed at re-examining the bases of the methodology presented in the International Standard ISO 8996 for the evaluation of the metabolic rate at work from a continuous recording of the heart rate during a representative period of time and to check the assertion of a precision of 10% for this evaluation. The study made it possible to select a set of formulas allowing to estimate the maximum working capacity, the resting metabolic rate, the heart rates of rest and maximum, and to quantify their reliability. The methodology of analysis of a HR recording at a work station and estimation of the metabolic rate has been modified and it is intended to revise the formulas of the ISO 8996 standard accordingly. Using a Monte Carlo simulation, it was possible to verify that the standard deviation of the equivalent metabolic rate evaluated by this modified method is of the order of magnitude of 10% to 14% as announced in the standard. Although this uncertainty is quite large, it can reasonably be considered that this method provides more reliable results than other methods that can be used in practice in the field, provided that it is carried out by people mastering the complexity of the underlying physiological concepts.
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| SD_{MWC}  | Standard deviation of MWC  | W or W/m² |
|------------|---------------------------|------------|
| SD_{Wb}    | Standard deviation of Wb   | kg         |
| W_1, W_2, W_3, W_4 | Radom values in a Gaussian distribution |
| VO_{bmax}  | Maximum oxygen consumption | l/min      |
| W_b        | Body mass                  | kg         |
| W_{ibd}    | Ideal body mass            | kg         |
| W_{nbldw}  | Ideal body mass of men     | kg         |
| ΔHR_{M}    | HR increase due to the dynamic muscular load, under neutral thermal conditions | bpm       |
| ΔHR_{S}    | HR increase associated to mental effects | bpm       |
| ΔHR_{W}    | HR increase due to static muscular work | bpm       |
| ΔHR_{I}    | HR increase associated with the increase in core temperature | bpm       |
| ΔHR_{R}    | residual component of the instantaneous heart rate | bpm       |
| θ          | Sum of the components of heart rate other than from dynamic muscular load | bpm       |

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