

# Properties and clinical implications of body mass indices

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## Abstract

The properties of body mass indices were evaluated in a cross sectional study of the weights and heights of 5016 Chinese boys and girls aged between 3 and 18 years. Of the indices examined (weight/height (W/H), weight/height<sup>2</sup> (W/H<sup>2</sup>), weight/height<sup>3</sup> (W/H<sup>3</sup>) and weight/height<sup>p</sup> (W/H<sup>p</sup>)), W/H<sup>p</sup> was the only one that consistently showed least correlation with height, and so could be regarded as the optimal body mass index by the criterion of independence of the index from height. The exponent 'p' of W/H<sup>p</sup> is, however, highly dependent on age; the value increases steadily between the age of 3 and 7-9 years, and then varies considerably around puberty. Only the age specific exponent ensures a lack of correlation between body mass index (W/H<sup>p</sup>) and height. Age specific W/H<sup>p</sup> should therefore be used in intrapopulation studies of weight or problems associated with obesity in children. Interpopulation comparison of weight and adiposity by W/H, W/H<sup>2</sup>, or W/H<sup>3</sup> may give misleading results because of their dependence on height. Our results also suggest that the conventional weight for height charts may not be accurate enough for clinical use.

Weight for height indices (body mass indices) have been extensively used as indirect measures of obesity to study the nutritional state of children and the epidemiology of diseases associated with obesity. Derived solely from measurements of weight and height, the optimal body mass index should correlate most accurately with weight and adiposity, and be only minimally biased by height.<sup>1</sup> The latter assumption is justified by the independency of adiposity to height.<sup>2-4</sup> Despite their high intercorrelations and similar correlations with weight and adiposity,<sup>5-7</sup> traditional body mass indices (weight/height (W/H), weight/height<sup>2</sup> (W/H<sup>2</sup>), weight/height<sup>3</sup> (W/H<sup>3</sup>) and weight/height<sup>p</sup> (W/H<sup>p</sup>)) do not seem to be interchangeable in exploring associations between obesity and disease<sup>8</sup> and the incidence of obesity.<sup>9,10</sup> Indiscriminate use of body mass indices may result in contradictory clinical inferences. For equal correlations with adiposity and body weight, it is probable that the best body mass index would be the one that was the least dependent on height; this can be found by calculating the best exponent 'p' for Benn's index (W/H<sup>p</sup>).<sup>11</sup> In heterogeneous adult populations, 'p' is usually close to 2, and therefore W/H<sup>2</sup> has been consistently recommended as the power index.<sup>3-5</sup> In children, however, 'p' is expected to vary when

tissue composition and body frame change rapidly during growth and puberty. We studied the serial change in the exponent of Benn's index (W/H<sup>p</sup>) from childhood to adulthood so that we could compare the properties of the different body mass indices and discuss the clinical implications.

## Patients and methods

A total of 2480 boys and 2536 girls aged from 3 to 18 years were recruited from five schools and four kindergartens between 1984 and 1986. These institutes were located in different areas of Hong Kong. All children belonging to randomly selected classes were studied. Essentially, therefore, our subjects represented an even social class distribution of Hong Kong. Children who had had recent acute or chronic illnesses, as well as those with obvious dysmorphic features and skeletal deformities, were excluded.<sup>12,13</sup> Standing height was measured with a Harpenden stadiometer to the nearest mm,<sup>14</sup> and body weight was recorded on a calibrated scale to the nearest 50 g for children under 7 years old, and the nearest 0.2 kg for older children. Children were measured and weighed without shoes and in standard light summer uniform (which weighed <0.2 kg). Decimal age was calculated from the date of birth and the date of examination.

## STATISTICAL METHOD

Body mass indices were computed separately for boys and girls, who were divided into age groups in yearly intervals from 3 to 17 years, as well as for all age groups combined. W/H, W/H<sup>2</sup>, and W/H<sup>3</sup> were calculated directly from weight (kg) and height (cm). The exponent 'p' of Benn's index (W/H<sup>p</sup>) and their standard errors (SE) for each age specific group and the overall age groups were computed in two different ways: firstly, more accurately, as the slope of the linear regression of logarithmic transformed weights and heights and, secondly, as  $\beta \times \text{mean height/mean weight}$  according to Benn's approximation principle, where  $\beta$  is the slope of the linear regression of weight on height for the individual groups concerned.<sup>11</sup> The linear regression was weighted against the reciprocal of W<sup>2</sup> because of heterogeneity of variance.<sup>15</sup> The non-parametric Spearman rank method was used to correlate the derived body mass indices with the heights, because the measurements of height were not normally distributed. The  $\chi^2$  test was used to assess the significance of differences between groups.

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**Results**

The exponents (p) of W/H<sup>p</sup> derived by logarithmic regression are comparable with those approximated by weighted linear regression for age specific and all age groups from the age of 3 to 6 years (table 1). Their values rise steadily until the age of 6 years; they then climb rapidly and peak at the age of 9 years (p'=3.81) for boys and 7 years (p'=2.98) for girls. They peak again at the age of 11 years for both sexes before they decline to much lower values. The exponents for children older than 6, and for overall age groups estimated by Benn's modified approximation method, deviate significantly from those calculated by logarithmic linear regression.

In the age specific groups (table 2), Spearman rank correlation coefficients (in absolute values) that relate body mass index to standing height, rank highest for W/H, followed by W/H<sup>2</sup>, and finally by W/H<sup>3</sup> for groups at the age between around 7 to 13 years. The reverse is the case outside this age range. Age specific W/H<sup>p</sup> is the only body mass index that consistently fails to correlate with height. When the slope β of the logarithmic linear regression (log W on log H) for the overall sex specific group is used as the exponent of W/H<sup>p</sup> (p=β), the correlation between this body mass index and height in age specific groups becomes highly unpredictable and inconsistent (table 2). The absolute rank correlation coefficients vary between a negli-

gible 0.0019 and a highly significant 0.39 (p=0.0003). When all age groups are pooled, however, all the body mass indices (including W/H<sup>p</sup>, table 2) are significantly dependent on height. The age dependent properties of body mass indices are similar in boys and girls.

**Discussion**

The dependency of 'p' on age in children has not been studied thoroughly. Dugdale proposed W/H<sup>1.6</sup> and W/H<sup>2.42</sup> as age independent nutrition indices for children above and below 5 years old, respectively.<sup>10 16</sup> Cole has shown that 'p' rises from the age of 5 to 12 years by differentiating the National Center for Health Statistics (NCHS) median standard weight/height curves plotted against age.<sup>17</sup> The 'p' computed by this method, which ignores the data distribution and heterogeneity of variance in age specific subgroups, is not quite independent of height.<sup>11</sup> Our data have shown that the exponent of W/H<sup>p</sup> changes substantially with age. Although 'p' increases steadily in early childhood, its value around puberty becomes highly variable, and probably does not follow any pattern. Cole has recently observed that the 'p' for white boys peaks around the age of 11, about 18 months later than that of girls. The difference in the timing of spurts between the boys and girls has been attributed to the earlier occurrence of puberty in girls.<sup>18</sup> Such a

Table 1 Exponents for the W/H<sup>p</sup> body mass index and their standard errors

Age (years)	Boys			Girls		
	No of subjects	p' (SE)	p (SE)	No of subjects	p' (SE)	p (SE)
3	174	2.29 (0.13)	2.22 (0.14)	169	2.05 (0.14)	2.00 (0.14)
4	328	2.39 (0.10)	2.22 (0.11)	305	2.15 (0.10)	2.06 (0.10)
5	321	2.67 (0.12)	2.44 (0.13)	304	2.57 (0.13)	2.43 (0.14)
6	438	2.58 (0.12)	2.35 (0.14)	362	2.67 (0.13)	2.51 (0.15)
7	258	2.87 (0.17)	2.52 (0.20)	269	2.98 (0.16)	2.69 (0.17)
8	117	3.02 (0.29)	2.66 (0.32)	127	2.77 (0.23)	2.53 (0.24)
9	86	3.81 (0.30)	3.36 (0.34)	92	2.66 (0.22)	2.39 (0.24)
10	88	2.86 (0.40)	2.38 (0.45)	92	2.91 (0.33)	2.76 (0.36)
11	94	3.48 (0.37)	2.92 (0.42)	100	3.19 (0.31)	3.23 (0.31)
12	98	3.42 (0.28)	3.17 (0.30)	120	2.87 (0.31)	2.67 (0.33)
13	93	2.79 (0.29)	2.42 (0.35)	119	2.53 (0.31)	2.35 (0.34)
14	88	2.44 (0.32)	2.30 (0.35)	122	1.92 (0.36)	2.01 (0.38)
15	104	2.91 (0.34)	2.60 (0.37)	131	1.05 (0.24)	1.05 (0.27)
16	98	2.51 (0.31)	2.47 (0.32)	112	2.01 (0.35)	1.85 (0.36)
17	95	1.28 (0.41)	1.50 (0.35)	112	1.96 (0.33)	1.80 (0.35)
All ages	2480	2.57 (0.01)	2.20 (0.02)	2536	2.64 (0.02)	2.21 (0.02)

p'=Exponent derived from logarithmic transformed linear regression. p=Exponent derived from weighted linear regression.

Table 2 Spearman rank correlation coefficients for body mass indices and standing height

Age (years)	Boys					Girls				
	W/H <sup>p</sup>	W/H	W/H <sup>2</sup>	W/H <sup>3</sup>	W/H <sup>p'</sup>	W/H <sup>p</sup>	W/H	W/H <sup>2</sup>	W/H <sup>3</sup>	W/H <sup>p'</sup>
3	-0.03*	0.53	0.12*	-0.38	-0.17	0.02*	0.47	0.04*	-0.48	-0.31
4	-0.08*	0.61	0.16	-0.38*	-0.17	-0.01*	0.52	0.07*	-0.42	-0.26
5	-0.12*	0.61	0.23	-0.26	-0.06	-0.02*	0.59	0.25	-0.21	-0.05*
6	-0.06*	0.55	0.19	-0.23	-0.06*	-0.07*	0.56	0.22	-0.19	-0.05*
7	-0.11*	0.53	0.23	-0.15	0.01*	-0.02*	0.59	0.32	-0.03*	0.11*
8	-0.07*	0.59	0.29	-0.06*	0.08*	-0.02*	0.52	0.25	-0.09*	0.02*
9	-0.06*	0.76	0.58	0.24	0.39	0.00*	0.63	0.30	-0.13*	0.02*
10	-0.04*	0.48	0.23	-0.06*	0.04*	0.01*	0.59	0.35	-0.03*	0.12*
11	0.01*	0.59	0.36	0.10*	0.21	0.02*	0.56	0.36	0.09*	0.19*
12	-0.02*	0.67	0.49	0.14*	0.32	-0.01*	0.51	0.28	-0.06*	0.06*
13	-0.03*	0.60	0.33	-0.13*	0.06*	0.02*	0.41	0.18	-0.11*	0.00*
14	0.01*	0.44	0.15*	-0.16*	-0.04*	0.00*	0.24	-0.02*	-0.26	-0.18
15	-0.05*	0.43	0.21	-0.07*	0.04*	0.14*	0.15*	-0.13*	-0.38	-0.29
16	0.00*	0.44	0.15*	-0.16*	-0.02*	-0.05*	0.19*	-0.05*	-0.29	-0.21
17	-0.03*	0.17*	-0.06*	-0.31	-0.21	-0.02*	0.25	-0.03*	-0.29	-0.21
All ages		0.90	0.58	-0.59	-0.13		0.91	0.64	-0.49	-0.07

\*No significant correlation with height (p>0.05). P=Age specific exponent derived from slope of log linear regression for each age group. P'=Exponent derived from slope of log linear regression for all age groups.

difference between the two sexes was not, however, observed in our data. The 'p' for English children rises steadily from 1.82/2.42 (boys/girls) at the age of 4, to 2.89 (boys and girls) at the age of 11.<sup>19</sup> This striking age dependency of 'p' has not been observed in adults<sup>20-22</sup>; it may be attributed to differences in body frame, and patterns of growth as well as to variations in the distribution and deposition of adipose tissue in puberty and adolescence.<sup>23-25</sup>

Body mass index merely reflects body weights among different subjects and may not be the most reliable measure of obesity.<sup>26</sup> There is no simple and accurate alternative, however, with which to compare nutritional state and diseases associated with obesity in children. Hydrostatic weighting, whole body potassium scintillation counting, and electric impedance measurements are indirect estimations of adiposity that are not free from error<sup>27-29</sup> and are based on ideal but uncertain mathematical assumptions and models.<sup>21</sup> They are not suitable for routine clinical use or for epidemiological studies. Measurement of skinfold thickness is not easily reproducible.<sup>30 31</sup> Even among observers rigorously trained in the same anthropometric techniques, the interobserver measurement errors for measurement of skinfold thickness (variance ratios 2.5 to 4.8,  $p < 0.05$ ) are much greater than those for weight and stature (variance ratios 0.67 to 1.22,  $p > 0.05$ ).<sup>32</sup> Skinfold measurements may account for only as little as 16% of the variance of fat body mass estimated by underwater weighing<sup>33</sup> or measurement of potassium (<sup>40</sup>K).<sup>34</sup> Thus it is still uncertain which anthropometric measurement or combination of measurements may consistently claim to give a more accurate estimate of body fat.<sup>31 35</sup>

Inappropriate choice of body mass indices may lead to misleading conclusions about nutritional state, the incidence of obesity, and the epidemiology of diseases associated with obesity, because body mass indices are not interchangeable.<sup>8-10</sup> Dugdale and Lovell have shown that using W/H generated conflicting statistics about obesity in Australian children.<sup>10</sup> Fixed exponent body mass indices, when applied to the same sets of data, may show the opposite association between obesity and the risk of cancer,<sup>8</sup> or give inconsistent ranks to obesity among various ethnic groups.<sup>9</sup> Only the W/H<sup>p</sup> (that does not correlate with height) provides consistent data. The optimal body mass index must be independent of height, and this has been emphasised<sup>1 4 11 16</sup> and repeatedly stated in cross sectional as well as longitudinal studies of children,<sup>25 36 37</sup> adolescents and adults.<sup>3 4 19 23 24 33</sup> Himes and Roche, however, have reported a curvilinear correlation between fat thicknesses and stature in children between 6 to 12 weeks old, and in adults,<sup>38</sup> but their observations are open to criticism. Firstly, the inconsistent patterns of association with respect to sex, age, and measurements (fat thickness at calf and the level of the tenth rib) may be the result of a change in the distribution of body fat during growth. Secondly, the sample of children may not represent those who have much lower linear Pearson correlative

coefficients for stature and skin thickness.<sup>25 33 36 37</sup> The logical assumption that a good body mass index must be independent of measurement of height cannot therefore be confidently refuted.

Comparisons of nutritional state, or the epidemiology of diseases associated with obesity between two or more independent populations using body mass index are legitimate only when a constant exponent (p) is referred to the body mass index calculations.<sup>20</sup> For adults the W/H and W/H<sup>2</sup> (which are only relatively correlated with height) have been used as compromise 'fixed exponent' body mass indices for the comparison of obesity or nutritional state between populations known to have different 'p's.<sup>3 20 22</sup> Fixed exponent body mass indices, however, significantly correlate with height in children and therefore their use in interpopulation comparison cannot be justified. The high age dependency of 'p' clearly suggests that neither the widely used W/H<sup>2</sup>—nor any other body mass index with a constant exponent—is appropriate for comparing nutritional state and obesity between and within groups of children. Age specific 'p's should be used for accurate intrapopulation studies of problems of overweight in children.

The American weight for height standards published by the NCHS have been widely used in North America. These charts were constructed assuming the weight/height relationship was independent of age.<sup>39</sup> Our study has shown that the age specific 'p's differ materially from that for the whole age group. Accurate weight for height relationships can therefore only be elicited by using age specific centile charts.<sup>19</sup> Exclusion of older children in the construction of conventional NCHS weight for height charts may reduce but cannot eliminate the confounding influence of age on weight/height relationship.<sup>39</sup> These weight for height charts should be used cautiously for accurate estimation of weight for height centile or the assessment of nutritional and obesity state.

When age specific centile charts are not available, or when the age of the child is unknown, the index W/H<sup>p</sup> expressed as a fraction of the median of a reference population should be used. Cole suggested that W/H<sup>2</sup> (p=2) is the appropriate body mass index for preschool children and adults.<sup>17 18</sup> In early puberty, W/H<sup>2</sup> tends to assess tall or physically advanced children as being overweight. This puberty/age bias can be avoided by using W/H<sup>p</sup> around the age of 11 instead, and the value of 'p' may be estimated from an exponential mathematical model based on population studies.<sup>18</sup> There is, however, no consistent trend at puberty for the 'p' in our series. The exponent cannot be expressed by a simple mathematical model as a function of age and sex. Whether this is because of statistical bias or because there are genuine ethnic differences in body mass index as well as body frame and composition at puberty, remains to be answered.

In summary, age has a strong influence on the exponent of W/H<sup>p</sup>. The age specific W/H<sup>p</sup> is preferred to fixed exponent body mass indices in nutritional studies in children. For the same

reason, we warn against the indiscriminate use of conventional NCHS weight for height charts in the interpretation of the nutritional state of children.

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