A 2017 US Reference for Singleton Birth Weight Percentiles Using Obstetric Estimates of Gestation

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OBJECTIVE: To provide an updated birth weight–for–gestational age (BW-for-GA) reference in the United States by using the most recent, nationally representative birth data with obstetric estimates of gestational age (GA).

abstract

METHODS: We abstracted 3 285 552 singleton births between 22 and 42 weeks' gestation with nonmissing race and/or ethnicity, infant sex, parity, birth weight, and obstetric estimate of GA from the 2017 US natality files. We used 2 techniques (nonlinear, resistant smoothing [4253H] and lambda-mu-sigma) to derive smoothed BW-for-GA curves and compared resulting BW-for-GA cut-points at the third, 10th, 90th, and 97th percentiles with US references from 1999 to 2009.

RESULTS: The smoothed BW-for-GA curves from both techniques overlapped considerably with each other, with strong agreements seen between the 2 techniques (>99% agreement; κ -statistic >0.9) for BW-for-GA cut-points at the third, 10th, 90th, and 97th percentiles across all GAs. Cut-points from 2017 using the lambda-mu-sigma method captured 9.8% to 10.2% of births <10th and >90th percentiles and 2.6% to 3.3% of births below the third and above the 97th percentile across all GAs. However, cut-points from US references in 1999 and 2009 (when GA was based on last menstrual period) captured a much larger range of proportions of 2017 births at these thresholds, especially among preterm and postterm GA categories.

CONCLUSIONS: We have provided an updated BW-for-GA reference in the United States using the most recent births with obstetric estimates of GA and information to calculate continuous measures of birth size that are sex or parity specific.



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WHAT'S KNOWN ON THIS SUBJECT: Previous birth weight-for-gestational age references in the United States primarily incorporated gestational age estimated from maternal reports of last menstrual period rather than more accurate estimates and may not reflect the current sociodemographic composition of the United States.

WHAT THIS STUDY ADDS: We have provided an updated birth weight-for-gestational age reference that uses the most recent birth data in the United States with obstetric estimates of gestational age and information to calculate continuous measures of birth size that are sex or parity specific.

To cite: Aris IM, Kleinman KP, Belfort MB, et al. A 2017 US Reference for Singleton Birth Weight Percentiles Using Obstetric Estimates of Gestation. *Pediatrics*. 2019;144(1): e20190076 Fetal growth, typically measured as birth weight for gestational age (BW-for-GA), is an important clinical indicator of perinatal morbidity, survival, and long-term health outcomes in children and their mothers.¹ Clinicians often use percentile thresholds (eg, ≤ 10 th or \geq 90th) of BW-for-GA from population-based references to identify at-risk infants who may have had restricted or excessive fetal growth. Additionally, researchers are increasingly making use of fetal growth measures on the continuous scale (ie, BW-for-GA z scores) to inform their studies examining predictors of fetal growth or associations of fetal growth with later outcomes.²

Although previous US references have provided the information needed to calculate continuous and categorical measures of fetal growth,^{3,4} they are based on data that may not reflect the most current sociodemographic composition of the United States. These references have also not compared existing methods for developing smoothed percentile curves^{5,6} because there may be 1 that is optimal.⁷ Furthermore, existing US references rely on gestational age (GA) estimated from maternal reports of last menstrual period (LMP),^{3,4,8} which are more prone to systematic error than obstetric estimates (ie, the clinician's best estimate incorporating all perinatal factors, including ultrasound, menstrual history, and laboratory values). Although 1 study in 2011 used obstetric GA estimates to create US BW-for-GA references, it did not include births from all US states because obstetric GA had not yet been adopted as the reporting standard on US birth certificates at the time.⁹ Beginning in 2014, the National Center for Health Statistics (NCHS) adopted the obstetric estimate as the new standard of GA reporting on all birth certificates because of increasing evidence of its greater validity.¹⁰ Recently, the

American College of Obstetricians and Gynecologists, American Institute of Ultrasound in Medicine, and Society for Maternal-Fetal Medicine recommended using the obstetric estimate for purposes of research and surveillance.¹¹ Given the concerns regarding the validity of LMP-based birth weight references, we believed it would be useful to create a nationally representative birth weight reference based on obstetric estimates of GA.

Therefore, we aim to create an updated BW-for-GA reference in the United States using the most recent, nationally representative data on birth weight and obstetric estimates of GA and compare 2 previously applied smoothing techniques (the nonlinear, resistant smoothing technique⁵ and the lambda-mu-sigma [LMS] method⁶) for developing percentile curves.

METHODS

Study Population

We used data on 3864754 live births from the 2017 US natality files,¹² a database of US birth certificates publicly available from the National Vital Statistics System of the NCHS. We restricted our analysis to singleton live births at 22 to 42 completed weeks' gestation and excluded mothers <18 years old (as fetal growth differs in adolescent versus adult mothers¹³); newborns with missing birth weight, parity, or race and/or ethnicity; and those with imputed GA or plurality. We used the obstetric estimate of gestation at delivery as our primary source of GA.¹⁰ To further reduce likely errors in GA reporting, we restricted our analysis to records in which both the LMP and obstetric estimates of GA were within 2 weeks of each other.⁴

We applied the criteria of Alexander et al⁸ to exclude records with implausible birth weights at each GA and in which the GA- and sex-specific birth weight *z* scores (calculated by using GA-specific medians and SDs within the current data set) were beyond the acceptable range (for GA \geq 37 weeks, <-5 or >+5 SDs; for GA <37 weeks, <-4 or >+3 SDs).⁴ We retained data on 3 285 552 births (85.0%; Fig 1). This study was exempt from institutional review board review under paragraph 4 of the Department of Health and Human Services Code of Regulations.

Statistical Analysis

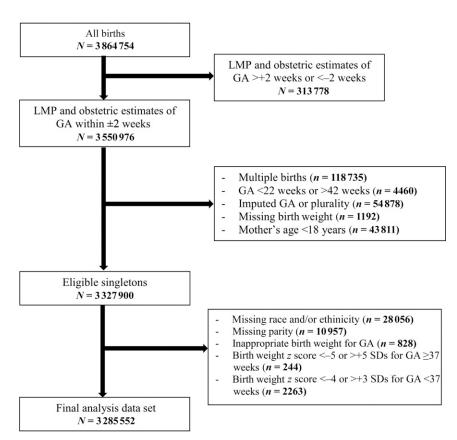
We applied 2 techniques to generate GA-specific percentiles for birth weight. The first is a nonlinear, resistant smoothing technique $(4253H, twice)^5$ previously used to generate reference percentiles from the 1999–2009 US natality files. This method has been detailed previously^{3,4}; briefly, it is not based on distributional assumptions and reduces the impact of irregularities in the percentile curves across GA groups to obtain smoothed estimates. It provides smoothed percentiles but not *z* scores.

The second is the LMS technique, which models birth weight as a function of GA by fitting the Box-Cox t distribution that takes into account the degree of skewness (L), central tendency (M), dispersion (S), and kurtosis of the data.¹⁴ The model estimates the LMS parameters, which are smoothed by using P-splines to obtain GA-specific percentiles from the smoothed model parameters. Furthermore, it permits transformation of birth weight into GA-specific birth weight *z* scores and percentiles by using the following formulas:

$$z(t) = rac{\left[y(t) \ / \ M(t)
ight]^{L(t)} - 1}{L(t) \ S(t)}$$

where *t* represents GA (in completed weeks), and *y* represents birth weight.

With the values of L(t), M(t), and S(t), the 100α percentile is given by the following:





$$P_{100\alpha}(t) = M(t)[1$$

$$+ L(t)S(t)Z_{\alpha}]^{\overline{L(t)}}$$

$$= M(t)[1 + S(t)Z_{\alpha}]$$

where Z_{α} is the standard normal deviate that gives $100\alpha\%$ cumulative probability. This method relies on the assumption that after transformation, the variables of interest would follow a normal distribution.¹⁵

We plotted the smoothed percentiles of birth weight across completed weeks' gestation at the third, 10th, 50th, 90th, and 97th percentiles to identify deviations in the percentile curves generated using both techniques. We used κ -statistics to assess for agreement of BW-for-GA cut-points generated from both techniques at the following thresholds: \leq 3rd or 10th percentile and \geq 90th or 97th percentile. We also used smoothed BW-for-GA cut-points at the third, 10th, 90th, and 97th percentiles previously derived from the 1999-2009 US birth weight references (in which GA was LMP based) and applied them to our current 2017 data set. We compared the proportion of births at these cutpoints from different reference years (and using the LMP measure of GA) to those derived by using the 2017 data (and obstetric measure of GA). We used the Generalized Additive Models for Location Scale and Shape package in R version 3.4.4 for the LMS smoothing technique and Stata 15.1 (Stata Corp, College Station, TX) for the 4253H smoothing technique and all other analyses.

RESULTS

Population Description

A total of 3 028 526 births (92.2%) were term (37–41 6/7 weeks),

61106 (1.9%) were early preterm (22-33 6/7 weeks), 185 724 (5.6%) were late preterm (34-36 6/7 weeks), and 10 196 (0.3%) were postterm (42 weeks). Male infants comprised 1 682 373 (51.2%), and female infants comprised 1603179 (48.8%) births. There were 1011524 (30.8%) first-born infants, 939181 (28.6%) second-born infants, and 1334847 (40.6%) third-ormore-born infants. Additionally, 1730913 (52.7%) were non-Hispanic white, 454 698 (13.8%) were non-Hispanic black, 774 265 (23.6%) were Hispanic, and 325 676 (9.9%) were Asian American or other.

Comparisons Between LMS and 4253H Smoothing Methods

The smoothed birth weight curves derived for male and female infants at the third, 10th, 50th, 90th, and 97th percentiles by using the LMS technique overlapped considerably at all GAs with those derived by using the 4253H smoothing technique (Fig 2). For example, in male infants, the estimated 10th percentile cutpoint at 40 weeks was 3068 g by using LMS and 3065 g by using the 4253H smoothing technique, whereas the 90th percentile cutpoints were 4122 and 4125 g, respectively. Similarly, in female infants, the estimated 10th percentile cut-points at 40 weeks were 2958 and 2955 g by using the LMS and the 4253H smoothing techniques, respectively, whereas the 90th percentile cut-points were 3968 and 3969 g, respectively. We observed strong agreements (>99% agreement; κ -statistic >0.9) for BWfor-GA cut-points at the third, 10th, 90th, and 97th percentiles between the LMS and 4253H smoothing techniques across all GAs (Table 1).

We have provided GA-specific LMS values (Tables 2 and 3) and BW-for-GA cut-points at the third, 10th, 25th, 50th, 75th, 90th, and 97th percentiles (Supplemental Tables 4 through 11) for male and female

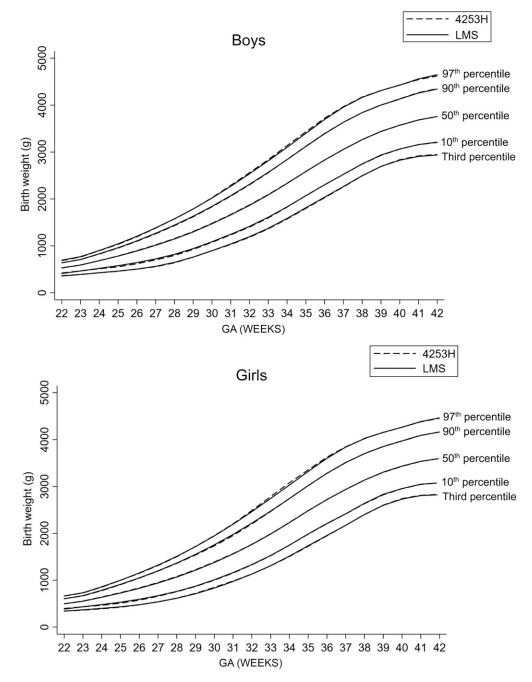


FIGURE 2 Comparison of smoothed BW-for-GA percentile curves between the LMS and 4253H smoothing technique.

infants as well as first-, second-, and third-or-more-born infants. As expected, at each GA, the median values (representing birth weights) were higher among male than female infants and among non-first-born than first-born infants of both sexes. The LMS values can be used for calculation of BW-for-GA *z* scores that are sex or parity specific. For example, suppose we wanted to calculate the BW-for-GA *z* score of a female infant born at 3000 g at 38 weeks' gestation; we could use the corresponding LMS values at 38 weeks' gestation with the *z* score equation provided in our Methods section; this would correspond to the following:

$$z(t_{38}) = \frac{[3000 / 3143.923]^{0.251} - 1}{0.251 \times 0.126}$$

= -0.37

Similarly, for a male infant born at 3000 g at 38 weeks' gestation, the z score would correspond to the following:

TABLE 1 Agreement of BW-for-GA Cut-points Generated by the LMS and 4253H Smoothing Techniques

GA, wk	% Agreement, κ -Statistic of BW-for-GA Percentile								
	Third	10th	90th	97th					
22	99.6, 0.94	99.4, 0.96	97.9, 0.89	99.4, 0.89					
23	99.3, 0.88	98.8, 0.93	98.9, 0.94	99.4, 0.90					
24	99.3, 0.89	99.4, 0.97	99.6, 0.98	99.7, 0.94					
25	99.9, 0.97	97.9, 0.90	99.1, 0.95	99.7, 0.95					
26	99.6, 0.93	98.6, 0.93	98.6, 0.92	99.6, 0.94					
27	99.9, 0.99	99.1, 0.95	99.4, 0.97	99.6, 0.92					
28	99.7, 0.95	98.5, 0.92	99.7, 0.99	99.9, 0.99					
29	99.9, 0.98	99.3, 0.96	98.9, 0.94	99.7, 0.95					
30	99.8, 0.96	99.3, 0.96	98.9, 0.94	99.8, 0.97					
31	99.8, 0.97	99.3, 0.96	99.0, 0.94	99.8, 0.96					
32	99.9, 0.98	99.7, 0.98	99.2, 0.95	99.8, 0.97					
33	99.9, 0.98	99.5, 0.97	99.9, 0.99	99.4, 0.91					
34	99.7, 0.95	99.9, 0.99	99.5, 0.97	99.7, 0.95					
35	99.8, 0.96	99.9, 0.99	99.4, 0.97	99.2, 0.87					
36	99.9, 0.97	99.9, 0.99	99.5, 0.97	99.9, 0.99					
37	99.9, 0.99	99.7, 0.99	99.9, 0.99	99.8, 0.97					
38	99.9, 0.99	99.9, 0.99	99.9, 0.99	99.8, 0.97					
39	99.8, 0.96	99.9, 0.99	99.9, 0.99	99.9, 0.98					
40	99.7, 0.94	99.9, 0.99	99.9, 0.99	99.9, 0.99					
41	99.7, 0.94	99.3, 0.96	99.9, 0.99	99.9, 0.99					
42	99.9, 0.98	99.9, 0.99	99.8, 0.99	99.6, 0.93					

$$z(t_{38}) = \frac{[3000 / 3272.907]^{0.346} - 1}{0.346 \times 0.125}$$

= -0.69

Additionally, we created an interactive Web application *z* score calculator (https://izzuddin-aris.

shinyapps.io/BW-for-GA_ *z*-score_webapp/) that provides sexand parity-specific *z* scores and percentiles either for 1 or many infants, of which the latter is based on a user-specified data set containing GA, infant sex, parity, and birth weight. We have provided details and instructions on its usage in the Supplemental Information.

The coefficients of skewness and kurtosis for the quantile residuals by using the LMS technique were -0.002 and 3.00, respectively,

TABLE 2 LMS Values For Each GA in Male Infants

GA, wk	All $(n = 1\ 682\ 373)$			First-born ($n = 519640$)			Second-born ($n = 480397$)			Third-born or More $(n = 682336)$		
	Skewness	Central Tendency	Dispersion	Skewness	Central Tendency	Dispersion	Skewness	Central Tendency	Dispersion	Skewness	Central Tendency	Dispersion
22	1.362	494.570	0.142	1.514	503.890	0.139	1.416	490.613	0.143	1.412	491.272	0.144
23	1.435	595.591	0.153	1.520	592.519	0.156	1.577	594.991	0.153	1.345	595.448	0.155
24	1.509	681.817	0.168	1.510	683.038	0.175	1.713	683.382	0.164	1.363	681.511	0.167
25	1.559	777.477	0.183	1.466	773.691	0.194	1.783	778.435	0.176	1.460	778.720	0.177
26	1.554	886.921	0.196	1.377	873.465	0.209	1.758	894.750	0.189	1.604	893.221	0.186
27	1.484	1008.568	0.206	1.259	987.207	0.218	1.642	1013.942	0.198	1.676	1025.615	0.192
28	1.368	1142.504	0.209	1.149	1113.391	0.220	1.467	1136.068	0.201	1.590	1168.299	0.195
29	1.238	1290.461	0.204	1.066	1262.635	0.215	1.284	1289.005	0.198	1.393	1318.953	0.192
30	1.124	1465.963	0.196	1.009	1429.091	0.207	1.129	1467.644	0.193	1.200	1491.746	0.187
31	1.041	1660.905	0.189	0.973	1607.149	0.199	1.024	1664.078	0.187	1.061	1688.923	0.181
32	0.980	1855.855	0.182	0.945	1802.863	0.191	0.977	1862.363	0.178	0.992	1895.276	0.176
33	0.934	2081.769	0.173	0.930	2022.571	0.179	0.959	2086.358	0.169	0.944	2121.876	0.170
34	0.905	2328.236	0.163	0.929	2268.521	0.166	0.927	2337.080	0.159	0.880	2361.383	0.160
35	0.872	2586.847	0.152	0.910	2531.031	0.156	0.856	2609.473	0.150	0.830	2622.735	0.150
36	0.712	2840.807	0.144	0.826	2764.645	0.146	0.706	2853.999	0.140	0.682	2867.194	0.142
37	0.486	3057.622	0.135	0.659	2982.338	0.136	0.476	3084.363	0.132	0.358	3097.129	0.135
38	0.346	3272.907	0.125	0.491	3188.996	0.124	0.332	3290.043	0.123	0.318	3313.787	0.124
39	0.355	3461.522	0.117	0.392	3377.400	0.117	0.316	3481.397	0.115	0.332	3497.917	0.116
40	0.434	3572.973	0.112	0.410	3511.618	0.112	0.439	3595.810	0.110	0.484	3626.356	0.112
41	0.498	3686.785	0.111	0.485	3636.136	0.110	0.521	3713.892	0.109	0.554	3750.680	0.112
42	0.593	3797.275	0.116	0.604	3740.548	0.110	0.622	3806.397	0.113	0.679	3867.182	0.118

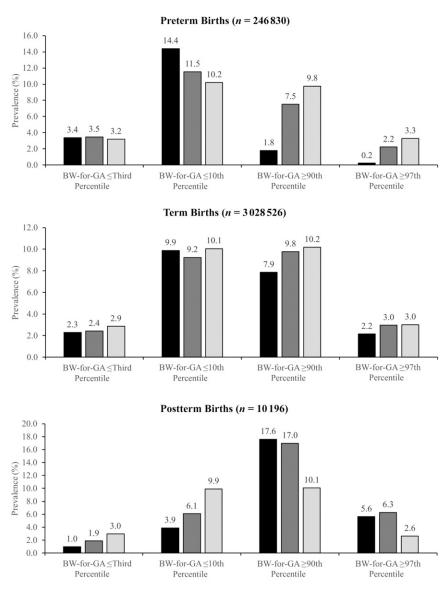
indicating a good approximation of a normal distribution of BW-for-GA zscore (Supplemental Fig 4).

Comparisons With Previous References

BW-for-GA cut-points derived from the 2017 data set by using the LMS method identified 9.8% to 10.2% of births as ≤ 10 th or ≥ 90 th percentile and 2.6% to 3.3% of births as \leq 3rd and \geq 97th percentile across preterm, term, and postterm GA categories. However, as shown in Fig 3, cutpoints from US references based on data from 1999 to 2009 yielded a much larger variation in proportions of 2017 births at these thresholds, especially for preterm and postterm GA categories. Among preterm births, the 10th percentile cut-points from previous references captured 11.5% to 14.4% of births, whereas the 90th and 97th percentiles captured a smaller proportion of births than expected (90th percentile, 1.8%-7.5%; 97th percentile, 0.2%-2.2%). In postterm births, the third and 10th percentiles using the earlier reference data captured a smaller proportion of births (third percentile, 1.0%–1.9%; 10th percentile, 3.9%-6.1%), whereas the 90th and 97th percentiles captured a larger proportion of births than expected (90th percentile, 17.0%-17.6%; 97th percentile, 5.6%-6.3%). Among term births, the percentile cut-points from the 2009 reference captured similar proportions of births when compared with our methods. The 1999 reference, however, captured a smaller proportion of births than expected at the 90th (7.9%) and the 97th (2.2%) percentiles.

DISCUSSION

In this study, we have provided an updated BW-for-GA reference using nationwide US birth data in 2017 together with information required to calculate continuous and/or categorical measures of birth size that



■ Cutoffs from

1999 reference

■ Cutoffs from

2009 reference

□ Cutoffs from

2017 reference

FIGURE 3

Prevalence of births at the third, 10th, 90th, and 97th percentiles in preterm (22–36 weeks' gestation), term (37–41 weeks' gestation), and postterm (42 weeks' gestation) infants according to previous US birth weight references.

are sex or parity specific. This reference reflects the current sociodemographic composition of the United States.

An important contribution of our new reference is the use of the obstetric, rather than LMP, estimate of GA. Birth weight is generally well measured, even in administrative data.¹⁶ Population references for BW-for-GA thus depend greatly on accurate assessments of GA. Previous studies questioned the accuracy of the LMP, used in most previous birth weight references, as a method of calculating GA.^{17,18} In an analysis of singleton births from the 2005 natality files, Callaghan et al¹⁹ reported that using the obstetric estimate of gestation resulted in BW-for-GA distributions that were identical to the gold

TABLE 3 LMS	Values	For	Each	GA	in	Female	Infants
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GA, wk	All (<i>n</i> = 1 603 179)			First-born ($n = 491884$)			Second-born ($n = 458784$)			Third-born or More $(n = 652511)$		
	Skewness	Central Tendency	Dispersion	Skewness	Central Tendency	Dispersion	Skewness	Central Tendency	Dispersion	Skewness	Central Tendency	Dispersion
22	0.868	469.074	0.137	0.603	466.402	0.158	1.086	477.578	0.140	1.114	468.365	0.134
23	1.061	552.366	0.156	0.788	545.404	0.176	1.194	556.563	0.159	1.212	553.062	0.151
24	1.181	633.758	0.180	0.930	625.038	0.195	1.262	635.634	0.180	1.265	640.210	0.171
25	1.207	725.641	0.200	1.016	712.144	0.211	1.267	725.021	0.199	1.266	734.829	0.188
26	1.174	823.942	0.212	1.047	812.602	0.221	1.215	823.842	0.211	1.243	834.294	0.201
27	1.123	937.473	0.216	1.041	924.822	0.223	1.133	931.891	0.215	1.213	948.241	0.208
28	1.067	1062.797	0.217	1.017	1041.628	0.220	1.046	1059.154	0.216	1.157	1083.759	0.208
29	1.001	1208.956	0.213	0.983	1170.746	0.214	0.975	1210.711	0.212	1.063	1237.360	0.204
30	0.916	1375.672	0.205	0.905	1325.737	0.207	0.904	1378.155	0.205	0.944	1408.759	0.196
31	0.818	1555.810	0.196	0.771	1505.975	0.202	0.839	1560.118	0.198	0.843	1589.373	0.186
32	0.720	1758.998	0.188	0.638	1703.148	0.193	0.787	1764.394	0.190	0.757	1794.154	0.178
33	0.659	1978.934	0.177	0.571	1922.379	0.180	0.761	1989.897	0.180	0.702	2014.675	0.170
34	0.674	2225.948	0.164	0.620	2174.540	0.167	0.758	2230.023	0.166	0.666	2257.301	0.160
35	0.680	2487.121	0.153	0.715	2432.968	0.155	0.697	2502.026	0.152	0.612	2517.864	0.152
36	0.546	2731.347	0.147	0.698	2671.268	0.147	0.560	2740.178	0.144	0.472	2755.493	0.146
37	0.369	2936.346	0.139	0.544	2872.597	0.138	0.392	2954.137	0.138	0.268	2970.125	0.139
38	0.251	3143.923	0.126	0.371	3071.299	0.125	0.277	3158.383	0.124	0.208	3180.603	0.126
39	0.232	3324.318	0.117	0.258	3250.409	0.116	0.215	3338.457	0.115	0.232	3357.969	0.117
40	0.293	3436.793	0.111	0.276	3383.711	0.110	0.304	3455.533	0.110	0.355	3485.223	0.112
41	0.364	3546.078	0.110	0.312	3497.869	0.109	0.385	3571.537	0.109	0.496	3604.003	0.110
42	0.477	3623.167	0.118	0.395	3592.890	0.114	0.434	3636.667	0.115	0.704	3686.437	0.118

standard of estimated GA, defined as when obstetric and LMP estimates of GA agreed within 1 week of each other, the mother entered prenatal care in the first trimester, and no congenital anomalies were present. Using LMP estimates, however, resulted in BW-for-GA distributions that were substantially different from the gold standard.¹⁹ This suggests that previous US BW-for-GA references that used LMP estimates of GA should be revisited. Furthermore, beginning in the 2014 data year, NCHS adopted the obstetric estimate as the new standard of GA reporting on birth certificates¹⁰ because of evidence of its greater validity.

Hence, our updated BW-for-GA charts not only reflect size at birth in the current US population, it is also based on a more reliable measure of GA. Previous studies showed that other determinants of fetal growth, including maternal height, prepregnancy weight, gestational weight gain, rates of gestational diabetes, and smoking during pregnancy, have been changing over time. For example, maternal weight and gestational weight gain have both shown increases over the past decades in the United States.^{20,21} Recent surveillance data now show that the rate of gestational diabetes increased by 0.4 percentage points from 2012 to 2016.²² On the other hand, smoking during pregnancy, a strong predictor of lower fetal growth, has been declining.²³ These secular trends in pregnancy characteristics are likely to contribute to changes in birth weight distributions over time, further emphasizing the need for a fetal growth reference that reflects the current sociodemographic composition of the United States.

Another important contribution of our study pertains to the feasibility of the LMS smoothing technique to derive BW-for-GA curves for the US natality data set. Currently, a variety of methods are available for developing smoothed percentile curves, and there is no single method that is effective for all situations and purposes. Previous US birth weight references had used the 4253H smoothing technique,^{3,4} which makes no parametric or other modeling assumptions, and the eventual percentile curves often tend to be close to the empirical data. The LMS technique, commonly used to derive BW-for-GA curves in other populations,^{24,25} has yet to be demonstrated to be appropriate for US birth data because it requires more assumptions (ie, after transforming birth weight into BW-for-GA *z* scores, the z scores are normally distributed).⁷ We have provided evidence that BWfor-GA curves derived by using both techniques overlapped considerably at all GAs. Furthermore, the LMS technique permits direct calculation of zscores, is easier to use, and provides investigators with a continuous measure of birth weight disentangled from the effects of gestational length, making it useful for studies examining predictors of fetal growth or associations of fetal growth on later outcomes.

When we applied cut-points from previous US references to the 2017 data set, we noted discrepancies from expected proportions that were most apparent in pre- and postterm GAs, likely due to the use of the obstetric estimate of GA in the 2017 data set. Compared with our reference, previous references identified a greater proportion of preterm births as small for GA (<10th percentile) and a lower proportion of births as large for GA (>90th percentile). This indicated that BWfor-GA cut-points for preterm births from previous US references were larger compared with ours (particularly evident for the 1999 reference), perhaps because of the bimodal distribution of birth weights commonly observed among preterm births when GA is based primarily on LMP. This phenomenon is characterized by a dominant distribution consistent with the expected birth weight for preterm infants and a secondary distribution consistent with the expected birth weight for term infants, which would shift the BW-for-GA cut-point to be larger than expected.²⁶ We observed smaller differences between the 2009 reference and our reference, which could be due to a "cleaning algorithm" used by the authors to eliminate the second mode of birth weight distribution in the preterm GA range when constructing the 2009 references.⁴ The use of the obstetric estimate of GA also likely eliminated this bimodal distribution of birth weight among preterm births in our reference.

Conversely, in postterm births, previous references classified substantially fewer births as small for GA (below both the third and 10th percentiles) but greater proportion of births as large for GA, indicating that BW-for-GA cut-points for postterm births from previous US references were smaller compared with ours. These differences could also result from the different sources of GA used between references. It has been shown that LMP tends to overestimate GA in the postterm range when compared with the obstetric estimate¹⁰; thus, BW-for-GA cut-points for postterm births from previous US references would be smaller than expected when used

on a data set in which GA is based on the obstetric estimate. In term infants, we observed a smaller proportion of births than expected at the 90th and 97th percentiles for the 1999 reference compared with our reference, suggesting a secular trend of decreasing fetal growth, as previously reported.²⁷ The small differences between the 2009 and 2017 references, however, suggest that fetal growth may have stabilized from 2009. Further studies are warranted to examine the factors related to these trends.

The strengths of our study include a large sample involving almost all births in the most recent year in which data are available and therefore is nationally representative of current size for GA in the United States. Furthermore, the use of the obstetric estimate provides a more reliable measure of GA compared with previous US references, especially because the NCHS had adopted the obstetric estimate as the new standard of GA reporting on birth certificates, beginning in 2014.¹⁰ However, there are some limitations to consider. First, our reference, like those published previously,^{3,4,8} is based on crosssectional data at birth and does not reflect longitudinal growth of individual infants. Second, we chose not to construct BW-for-GA standards, which are generated from exclusion of highrisk pregnancies associated with alterations in birth weight.²⁸ Standards, such as those by the International Fetal and Newborn Growth Consortium for the 21st Century and Eunice Kennedy Shriver National Institute of Child Health and Human Development Fetal Growth Studies,^{29,30} differ conceptually from references, and given the limitations of vital records data,³¹ we cannot apply the same criteria used to generate standards in our current data set. Further studies are warranted to compare existing standards with our reference in predicting important health outcomes. We also chose not

to compare our reference to other frequently used references by Fenton et al³² or Olsen et al³³ because those references did not include births from all US states and therefore may not be nationally representative of size for GA in United States. Third, we chose not to provide race-specific birth weight percentiles; whereas sex and parity are immutable, differences in birth weight by race and/or ethnicity may likely reflect disparities in obstetric care and social and environmental circumstances.³⁴ Fourth, we were unable to provide birth length-for-GA, weight-for-length, or headcircumference-for-GA references because neither head circumference nor recumbent length are reported on US birth certificates. Lastly, despite the large sample size, there are a smaller number of infants at GA extremes; these estimates may be less reliable, particularly when stratified by sex and parity, and should be interpreted cautiously.

CONCLUSIONS

We have provided an updated and nationally representative birth weight reference that uses a more reliable estimate of GA and reflects the most recent sociodemographic composition in the United States. Given the concerns regarding the validity of LMP-based references, the need for an obstetric estimate-based reference has become increasingly appreciated. This new reference will allow researchers and clinicians to weigh its appropriateness against their specific needs.

ABBREVIATIONS

BW-for-GA: birth weight for gestational age GA: gestational age LMP: last menstrual period LMS: lambda-mu-sigma NCHS: National Center for Health Statistics Address correspondence to Izzuddin M. Aris, PhD, Division of Chronic Disease Research Across the Lifecourse, Department of Population Medicine, Harvard Medical School and Harvard Pilgrim Health Care Institute, 401 Park Dr, Suite 401E, Boston, MA 02215. E-mail: izzuddin_aris@harvardpilgrim.org

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