

1 **Relative effects of postnatal rapid growth and maternal factors on early childhood**
2 **growth trajectories**

3 Miaobing Zheng^{1*}, Steven J. Bowe², Kylie D Hesketh¹, Kristy Bolton³, Rachel Laws¹, Peter
4 Kremer³, Ken K. Ong^{4,5}, Sandrine Lioret^{6,7}, Elizabeth Denney-Wilson⁸, Karen J Campbell¹

5 ¹Deakin University, Geelong, Australia, Institute for Physical Activity and Nutrition, School
6 of Exercise and Nutrition Sciences

7 ²Deakin University, Geelong, Australia, Biostatistics Unit, Faculty of Health

8 ³Deakin University, Geelong, Australia, Centre for Sport Research, School of Exercise and
9 Nutrition Sciences

10 ⁴Medical Research Council Epidemiology Unit, University of Cambridge, Cambridge, UK.

11 ⁵Department of Paediatrics, University of Cambridge, Cambridge, UK

12 ⁶INSERM, U1153 Epidemiology and Biostatistics Sorbonne Paris Cité Research Center
13 (CRESS), Early Origin of the Child's Health and Development ORCHAD team, Villejuif,
14 France

15 ⁷Paris Descartes University, Paris, France

16 ⁸Sydney University Faculty of Medicine and Health, and Sydney Local Health District, New
17 South Wales, Australia

18 *Corresponding author

19 Miaobing Zheng

20 Mailing address: 221 Burwood Highway, Burwood, Victoria, 3125

21 Telephone number: 613 9248502

22 Fax number: 613 9244 6017

23 Email: j.zheng@deakin.edu.au

24 **Short title:** Determinants of growth in early childhood

25 **Conflict of interest:** Authors declare no conflict of interest.

26

27 **Abstract**

28 **Background:** A range of postnatal and maternal factors influences childhood obesity, but their
29 relative importance remains unclear. This study aimed to assess the relative impact of postnatal
30 rapid growth and maternal factors on early childhood growth trajectories.

31 **Subjects:** Secondary longitudinal analysis of pooled data from the Melbourne Infant Feeding
32 Activity and Nutrition Trial (InFANT) Program and the InFANT Extend Program (n=977)
33 were performed. Children's height and weight were collected at birth, 3, 9, 18, and 36/42
34 months. Body mass index-for-age and height for-age z-scores (BAZ, HAZ) were computed
35 using WHO growth standards. Mixed effect polynomial regression models were fitted to
36 examine BAZ and HAZ trajectories and their determinants.

37 **Results:** Rapid growth from birth to 3 months, maternal country of birth, and pre-pregnancy
38 BMI were each independently associated with BAZ from 3 to 42 months. Children with rapid
39 growth, those whose mothers were Australian-born, and those whose mothers were
40 overweight/obese pre-pregnancy had higher BAZ from 3 to 42 months. Children with rapid
41 growth had an increase in HAZ growth, but their average HAZ from 3 to 42 months was smaller
42 than children without rapid growth. Children of tall mothers (above average height) had higher
43 HAZ than those of short mothers (below average height). Average HAZ from 3 to 42 months
44 did not differ by maternal country of birth.

45 **Conclusion:** Children who experienced rapid growth from birth to 3months, whose mothers
46 were Australian-born or whose mothers were overweight/obese pre-pregnancy demonstrated
47 less favorable growth trajectories across early childhood, potentially predispose them for
48 development of future obesity.

49 Keywords: infant; growth; determinants; maternal; trajectory

50 **Introduction**

51 Infant growth is a sensitive indicator of nutrition and health status. Growth monitoring is a
52 widely promoted strategy worldwide for ensuring optimal health status in early life.
53 Description of early growth trajectories and determinants will provide insights into early
54 influences on later health and can inform design of future interventions and strategies ¹.

55

56 Child growth and obesity are influence by an array of genetics, environmental,
57 socioeconomic, and behavioural factors ². The programming effects of early factors in the
58 first 1000 days from conception to age 2 years in childhood obesity have been widely
59 acknowledged ³. Understanding the early origins of childhood obesity is imperative to inform
60 polices and interventions to optimise child growth and facilitate the early prevention of
61 childhood obesity ³. A range of early factors has been associated with childhood obesity.

62 Postnatal rapid growth, defined as upward centile crossing in weight growth charts within the
63 first 2 years of life, has been proposed as a pivotal factor programming later obesity, diabetes,
64 and cardiovascular disease ⁴⁻⁶. Apart from postnatal rapid growth, a range of maternal factors
65 such as pre-pregnancy overweight/obesity, and education (as proxy for socio-economic
66 position) have been identified as important in the genesis of childhood overweight and

67 obesity ⁷. However, the influence of these factors on longitudinal growth trajectories in early
68 childhood and their relative importance remains unclear. The preponderance of studies on
69 child growth have utilized a cross-sectional approach that does not permit evaluation of
70 longitudinal growth trajectories.

71

72 It is conceivable that both postnatal rapid growth and maternal factors play a crucial and
73 potentially synergistic role in child growth and obesity. Postnatal rapid growth may influence
74 hormones that regulate body composition, food intake and metabolism, that could in turn
75 affect growth and later health outcomes ⁸. Maternal factors contribute to complex genetic,
76 biological, social and environmental pathways of child growth and development. Maternal
77 overweight/obesity may contribute to an over-nutrition environment in-utero that promotes
78 excess fetal and postnatal growth via higher circulating insulin and other hormones through
79 both metabolic and genetic pathways ⁹. Maternal education as a proxy for socioeconomic
80 status (SES), is associated with feeding styles and family environment that may, in turn,
81 affect child growth ¹⁰. Examining the relative importance of postnatal rapid growth and
82 maternal factors will inform future research priorities for intervention.

83

84 Previous scholars highlight the lack of longitudinal research seeking to explain the relative
85 contribution of postnatal versus maternal factors on child growth and obesity ^{3,11}.

86 Therefore, in this study we aim to assess the relative effects of early postnatal rapid growth
87 and maternal factors on longitudinal trajectories of both standardized BMI and height in early

88 childhood within two cohorts of infants in the state of Victoria, Australia. The findings of this
89 study will

90

91 **Subjects and Methods**

92 *Study participants*

93 Data from the Melbourne Infant Feeding Activity and Nutrition Trial (InFANT) Program
94 (n=542) and the InFANT Extend Program (n=514) were used. The InFANT program was
95 registered with Current Controlled Trials (ISRCTN81847050) and the InFANT Extend
96 program was registered with the Australian New Zealand Clinical Trials Registry (ANZCTR
97 12611000386932). Ethical approval for both studies was granted by the Deakin University
98 Human Research Ethics Committee, the Victorian Office for Children and the Department of
99 Education and Early Childhood Development (Victoria, Australia). Details of these studies
100 have been reported previously¹²⁻¹⁴. In brief, the Melbourne InFANT Program was a 15-month
101 parent-focused intervention aiming to reduce infant obesity risk behaviors with subsequent
102 follow-up until age five years to test sustainability of intervention effects (June 2008 to
103 December 2013). First-time parent groups were recruited from 14 representative local
104 government areas of Melbourne, Australia during standard group meetings at Maternal and
105 Child Health Centers and randomized to intervention or control conditions. Intervention
106 strategies included six dietitian-delivered group education sessions that included information
107 on infant feeding, physical activity and sedentary behaviors. The control group received usual
108 care. The InFANT Extend Program was an extension of the Melbourne InFANT Program that
109 was conducted from June 2011 to October 2015 that utilized the same study design, in a

110 different cohort, with an additional post and online intervention delivered until the child was
111 three years of age. Previous analyses documented that there were no intervention effects on
112 growth and weight outcomes in either trial ¹⁵, and thus data from intervention and control
113 groups across both studies were pooled and utilized in the present analyses.

114

115 *Assessment of child anthropometrics*

116 In both studies, children's height/length and weight were reported by parents at birth and were
117 measured by trained staff at four time points when children's mean age was approximately 3
118 (T1), 9 (T2), 18 (T3), and 36 (InFANT Extend) or 42 (InFANT) months (T4). Height/length
119 was measured to the nearest 0.1 cm using a calibrated measuring mat or portable stadiometer
120 and weight (in light clothes) was measured to the nearest 10 grams using calibrated infant
121 digital scales ^{12, 14}. Both height/length and weight were measured twice, and the average was
122 used for analysis. Height/length-for-age z-score (HAZ), weight-for-age z-score (WAZ) and
123 BMI-for-age z-score (BAZ) were computed using World Health Organization (WHO) gender-
124 specific growth standards ¹⁶. BAZ and HAZ were used to describe growth in the current cohort.
125 Although WHO recommends the weight-for-height z-scores (WHZ) to classify overweight and
126 obesity in young children ¹⁶, BAZ was chosen over WHZ to allow better comparison with
127 research studies that mostly report on BAZ and also enables tracking of growth beyond the age
128 of 5 years. Evidence has also shown high agreement of BAZ and WHZ in growth monitoring
129 in young children ¹⁷.

130

131

132 *Early postnatal rapid growth*

133 Early postnatal rapid growth was defined as an increase in WAZ > 0.67 between birth and 3
134 months; this is clinically equivalent to crossing the centile lines in a growth chart and is a
135 widely accepted definition of rapid growth ⁵.

136

137 *Maternal factors*

138 Data on maternal country of birth, education level, height, pre-pregnancy weight, and
139 gestational age were assessed using a self-administered questionnaire completed at baseline.

140 Country of birth was classified as Australia or Not Australia. Maternal education level was

141 classified as either high (university degree and higher) or low

142 (certificate/diploma/apprenticeship/high school). Maternal pre-pregnancy body mass index

143 (BMI) (kg/m²) was calculated using self-reported weight and height, and categorized into

144 healthy-weight (<25kg/m²), and overweight/obese (≥25kg/m²). Maternal height (average ±SD

145 164.5 ± 7.0 cm) was classified into short (height ≤ average) or tall (height >average).

146 Gestational age was reported in weeks.

147

148 *Statistical analysis*

149 Descriptive analyses of child and maternal characteristics by study cohort were performed and

150 independent t-tests or Pearson's Chi-squared tests were used to compare characteristics by

151 study cohort. Mixed effect polynomial regression models (also known as multilevel growth

152 curve models) with both fixed and random effects, were used to construct the longitudinal

153 growth trajectories of BAZ and HAZ from 3 to 42 months ^{18, 19}. This method has been widely

154 used to elucidate longitudinal child growth trajectories¹⁹, allowing modelling of nonlinear
155 growth trajectories and assessment of determinants. It mitigates within-subject correlations and
156 unequal variances over time through use of the covariance structure. Furthermore, it permits
157 modeling of growth using unbalanced longitudinal data and does not exclude participants with
158 missing measurements. Inclusion of random intercepts and slopes allows individual variations
159 in growth trajectory. The basic model included repeated measures of BAZ and HAZ as the
160 dependent variable; age and age² as fixed effects; age and parent groups as random effects with
161 an unstructured covariance structure. The random effects take account of the cluster-based
162 nature of the sample and the correlation between individual repeated measures. The estimate
163 of age represents rate of growth (increase + β or decrease - β) and estimate of age² represents
164 acceleration (+ β) or deceleration (- β) of growth, which determines the curvilinear shape of the
165 growth trajectory. Parameters in the model were estimated through restricted maximum
166 likelihood methods. To explore if growth trajectories differed for early postnatal rapid growth
167 and maternal factors (country of birth, education, and pre-pregnancy BMI), these variables
168 were included in the model as fixed effects. Interactions of individual factors with age and age²
169 were also included in the model to allow rate of change in BAZ/HAZ to vary by these factors.
170 Only interactions associated with BAZ or HAZ with $P < 0.05$ were retained in the model.
171 Multivariable analyses including all individual factors simultaneously in the same model with
172 adjustment for child sex, intervention group, study cohort, gestational age, and BAZ or HAZ
173 at birth were conducted to assess respective effects on outcomes. Multicollinearity of all
174 independent variables was assessed and no variables were highly correlated²⁰, therefore, all
175 variables were included in the same model. Interactions among predictor variables were

176 performed to test potential synergistic effects, and no interaction effects were found. Average
177 BAZ and HAZ trajectories by child or maternal factors were plotted by predicted means at each
178 time point, and the difference in predicted means were tested using analysis of variance models
179 specifying a Bonferroni correction for multiple comparison. Stratified analysis by intervention
180 group was also conducted, the effect of rapid growth and maternal factors on growth
181 trajectories did not differ (Supplementary Table 3). All analyses were conducted using Stata
182 15.0²¹.

183

184 *Sensitivity analysis*

185 To account for missing data, we conducted a sensitivity analysis using multiple imputation
186 (MI). The number of observations available in the mixed effects analysis was 3065 (for
187 outcome and covariates). There are a number of MI approaches available and our preference
188 was MI by chained equations (MICE) due to its flexibility in determining imputation models²²,
189²³. The chained equation approach used separate conditional univariate imputation models
190 specified for each variable with missing data (i.e. logistic regressions for binary variables and
191 linear regressions for continuous variables)²⁴. Multiple imputation using chained equations
192 with 50 imputations and 10 burn-in iterations were fit simultaneously for both outcomes as
193 well as covariates considered in the mixed models.

194

195 **Results**

196 *Sample characteristics*

197 Of 1056 children, a total of 977 children (93% of total sample) with complete anthropometric

198 measures at ≥ 2 time points from birth to 36/42 months were included in the longitudinal
199 analyses. Children with anthropometric measures < 2 time points contribute no information
200 about change in BAZ/HAZ, and were thus excluded from analysis. A further 68 children was
201 excluded due to missing data on child or maternal factors, resulting a final sample of 909
202 children being included in the multivariable analysis (Figure 1). Comparison of children who
203 were included and excluded from analyses indicated no difference in any of the variables
204 (Supplementary Table 1). Descriptive statistics for child and maternal characteristics, number
205 of children at each follow-up, and outcome measurements at each time point by study cohort
206 are shown in Table 1. There were no differences on percentage of children who experienced
207 rapid growth from birth to three months, maternal country of birth, pre-pregnancy BMI, or
208 education level between the two cohorts. Compared with the InFANT Extend cohort, the
209 InFANT cohort included more tall mothers and gestational age was lower.

210

211 *Determinants of BAZ trajectories*

212 With adjustment for all covariates, results from the multivariable mixed effects models showed
213 that early postnatal rapid growth from birth to 3 months, maternal country of birth and pre-
214 pregnancy BMI, but not maternal education, were independently associated with BAZ
215 trajectory from 3 to 42 months (Table 2). Average BAZ trajectory had a sharp increase from 3
216 to 18 months followed by a plateau from 18 to 42 months (Figure 1). The BAZ trajectory curve
217 differed by early postnatal rapid growth and country of birth as indicated by significant age and
218 age² interactions (Table 2). Children with rapid growth in general had greater BAZ than
219 children without rapid growth (Figure 2). The mean difference in average BAZ from 3 to 42

220 months was 0.61 (95% CI 0.56, 0.66). Children of Australian born mothers (black lines) also
221 had higher average BAZ than did children of not Australian born mothers (grey lines) (mean
222 difference 0.15 95% CI 0.10, 0.20). BAZ of children whose mothers were overweight/obese
223 pre-pregnancy was also higher than children of healthy-weight mothers (round versus triangle
224 markers, mean difference 0.23 95% CI 0.19, 0.29). Moreover, children with rapid growth,
225 whose mothers were Australian born and overweight/obese pre-pregnancy had the highest BAZ
226 from age 3 to 42 months; whereas, children without rapid growth, whose mothers were not
227 Australian born and healthy-weight pre-pregnancy had the lowest BAZ (Figure 2). The mean
228 difference of average BAZ between these two groups was 1.07 (95% CI 0.97, 1.18).

229

230 *Determinants of HAZ trajectories*

231 Results of multivariable mixed models for HAZ demonstrated that early postnatal rapid growth
232 from birth to 3 months, maternal country of birth and height, but not maternal education, were
233 associated with HAZ trajectory from 3 to 42 months (Table 2). The HAZ trajectory curve
234 differed by rapid growth and maternal country of birth as indicated by significant age and age²
235 interactions ($P < 0.001$). From 3 to 18 months, HAZ of children with rapid growth increased or
236 remained stable, but all children without rapid growth had a sharp decrease in HAZ (Figure 3).
237 This was followed by a slight increase or plateau from 18 to 42 months in all children. The
238 average HAZ at 3 months of children with rapid growth was 0.48 (95% CI -0.67, -0.29) smaller
239 than children without rapid growth, but no difference was found in average HAZ from 9 to 42
240 months between the two groups. Despite the slopes of HAZ trajectory curve differing by
241 maternal country of birth (black versus grey lines, Figure 3), the average HAZ from 3 to 42

242 months was not different at all ages (data not shown). Children whose mothers were tall (round
243 markers) were in general taller than children of short mothers (triangle markers) at all ages
244 from 3 to 42 months (mean difference: 0.46 95% CI 0.39, 0.52). At 42 months, children with
245 rapid growth and whose mothers were Australian born and tall had the highest HAZ, whereas,
246 children with rapid growth whose mothers were not Australian born and short had the lowest
247 HAZ (mean difference 0.75 95% CI 0.04 1.47). No difference was found between maternal
248 pre-pregnancy BMI and HAZ trajectory (data not shown).

249

250 *Comparisons of mixed effects models with multiple imputation models*

251 Overall, analyses with the combined summary estimates from the multiple imputation revealed
252 similar results to the primary mixed models (Supplementary Tables 3). Wider 95% confidence
253 intervals were observed for some estimates. This was expected since the multiple imputation
254 process is designed to build additional uncertainty into the parameter (β) estimates^{22, 25}.

255

256 **Comment**

257 Principle findings

258 In two cohorts of Australian children, the present study found early postnatal rapid growth from
259 birth to 3 months and maternal factors had independent effects on trajectories of both BAZ and
260 HAZ in early childhood.

261

262 Strengths of the study

263 This study has a number of important strengths. Our study has a large sample size. The repeated

264 measures of height and weight by trained staff enabled the use of mixed effect polynomial
265 models to evaluate longitudinal trajectories of both BAZ and HAZ, and their determinants.
266 Moreover, multiple imputation was used to address missing data. Our findings on relative
267 effects of maternal factors and postnatal rapid growth on both BAZ and HAZ trajectories are
268 novel and extend the current understanding of growth in early childhood.

269

270 Limitations of the data

271 Our study also has several limitations. While the cohort included mothers and children across
272 the socioeconomic spectrum, highly educated mothers were overly represented and clearly this
273 may have implications for generalizability. We were unable to examine the influence of
274 specific maternal country of birth other than Australia on growth due to the large number of
275 international countries reported and limited number of participants from each country. Despite
276 the inclusion of many known covariates, unmeasured variables and residual confounding may
277 limit our findings. Maternal anthropometrics were self-reported after birth, thus recall bias and
278 potential misreporting cannot be ruled out. Evidence has shown that females tend to
279 underreport their body weight ²⁶, thus bias the association towards null, but we were still able
280 to find a differential effect for maternal pre-pregnancy BMI on child BAZ trajectory. We
281 studied the early determinants of child growth and obesity, other predictors of growth and
282 obesity such as infant feeding patterns, dietary intake and physical activity were not examined
283 in the present study.

284

285

286 Interpretation

287 Our findings suggest children demonstrating postnatal rapid growth as early as by 3 months of
288 age had higher BAZ after controlling for BAZ at birth and gestational age. Consistent with our
289 findings, two German studies in term children with an appropriate-for-gestational age birth
290 weight have reported that rapid growth from birth to 2 years predicted higher subsequent BAZ
291 and fat mass to age 6²⁷ and 7 year²⁸, respectively, after adjusting for BAZ at birth. The
292 proposed mechanisms by which postnatal rapid growth programs later obesity remains unclear.
293 It is hypothesized that rapid growth is more likely to occur among children with in-utero growth
294 restriction. However, in line with our findings, numerous studies report the association between
295 rapid growth and later obesity occurs independent of birth weight and is evident among
296 children without in-utero growth restriction^{5, 27, 28}.

297

298 We also found that having a mother born in Australia and/or one who was overweight/obese
299 pre-pregnancy increased the susceptibility of children with rapid growth to higher BAZ. A
300 small number of studies have utilized a longitudinal approach to examine the relative effects
301 of postnatal rapid growth and maternal factors on child growth²⁷. Findings from a cohort of
302 German children (n=370) demonstrated that postnatal rapid growth along with maternal
303 overweight predicted greatest change in fat mass from ages 2 to 6 years²⁷. Other studies have
304 examined the effects of maternal BMI alone or with other maternal factors on BMI
305 trajectories²⁹. In a cohort of European children, maternal BMI was found to be a strong
306 determinant of offspring BAZ from age two to three years³⁰. A large US study (n = 10700)
307 found maternal overweight/obesity along with diabetes and excessive gestational weight gain

308 were associated with the highest BAZ from 9 to 48 months ³¹. The influence of maternal BMI
309 on child BAZ is likely attributable to complex interactions of genetics and metabolic pathways.
310 Overweight/obese mothers may have a higher risk of metabolic dysfunction that may impact
311 on both fetal and postnatal child growth potentially through effects of higher circulating insulin
312 ⁹ Additionally, overweight/obese mothers may be more likely to have obesity promoting
313 dietary and lifestyle habits that may influence their children lifestyle behaviours and in turn
314 weight trajectories across early life. Evidence suggests that overweight/obese mothers are
315 prone to overfeeding practices ³².

316

317 To date few studies have evaluated the factors associated with early childhood height
318 trajectories. In the current study, we found early postnatal rapid growth, maternal country of
319 birth, and maternal height were determinants of HAZ trajectories from 3 to 42months. While
320 one previous study reported that HAZ trajectory did not differ substantially by maternal
321 overweight/obesity, diabetes, or excessive gestational weight gain among a US cohort ³¹, there
322 have been no studies reporting the longitudinal effect of early postnatal rapid growth on height
323 trajectory in early childhood. Our finding that children with rapid growth showed an increase
324 in HAZ growth after the period of rapid growth is likely a result of higher insulin-like growth
325 factors-1³³. It has to be noted that despite the initial increase in HAZ growth among children
326 with rapid growth, their average HAZ from 9 to 42 months remained similar to those who did
327 not show rapid growth. However, children with rapid growth had higher average BAZ than
328 children without rapid growth at all ages from 3 to 42 months, highlighting that children with
329 rapid growth may at higher risk of developing future obesity. Faster HAZ growth may not

330 necessarily offset future obesity risk, but it may be a precursor to earlier puberty³⁴. With respect
331 to maternal country of birth and height, it is plausible that they determine height growth through
332 genetics and/or the cultural difference in dietary and lifestyle pattern.

333

334 There is a scarcity of research regarding associations between maternal education or
335 socioeconomic position and children's growth trajectories³⁵. The null finding for maternal
336 education and growth trajectories in our study is not unexpected. Given postnatal rapid growth
337 and pre-pregnancy BMI are possible underlying mediators of the association between maternal
338 education and BAZ, the adjustment for these factors could potentially attenuate any direct
339 association. Indeed, in univariable analysis without adjusting for postnatal rapid growth and
340 other maternal factors, low maternal education was associated with higher BAZ ($\beta=0.11$,
341 $P=0.04$). Similar findings were also documented in a Dutch cohort showing that low maternal
342 education was associated with child weight-for-length gain, but the association attenuated after
343 adjusting for other maternal factors³⁶. In contrast, an Australian study demonstrated
344 differential effects of socioeconomic status on BMI trajectory among Aboriginal boys (mean
345 age: 11 year olds) with 8 years follow-up³⁷. It has to be noted that that study only adjusted for
346 recruitment phase, birth weight and Aboriginal status.

347

348 Our study findings have important public health implications. Children with early rapid growth,
349 and whose mothers were both Australian-born and overweight/obese pre-pregnancy
350 demonstrated the highest BAZ trajectory, but the average BAZ at 42 months was below 2 z-
351 scores (the WHO cut-off for overweight/obesity).¹⁶ It would be desirable to monitor the growth

352 of these children into later childhood to test the latent effects of these early determinants. We
353 cannot modify maternal country of birth. However, early postnatal rapid growth and maternal
354 pre-pregnancy overweight/obesity, as independent modifiable determinants of child BAZ,
355 provide important targets for early childhood obesity prevention. Public health campaigns
356 should focus on prevention of rapid growth in infancy and support mothers to achieve a healthy
357 body weight. This may be particularly important in the pre-conception and pregnancy period.
358 Future obesity prevention interventions should target children with rapid growth during infancy
359 and children of mothers who were overweight/obese pre-pregnancy as at highest risk.

360

361 Conclusions

362 In conclusion, the present study showed early postnatal rapid growth, maternal country of birth,
363 maternal pre-pregnancy BMI or height are each associated with growth trajectories in early
364 childhood. Children who experienced early rapid growth, those whose mothers were Australian
365 born, and those whose mothers were overweight/obese pre-pregnancy had higher BAZ in early
366 childhood. The findings underscore the importance of targeting these children for obesity
367 prevention.

368

369 Acknowledgements

370 We would like to acknowledge all parents and children who participated in the Melbourne
371 Infant Feeding Activity and Nutrition Trial (InFANT) Program and the InFANT Extend
372 Program.

373

374 **Conflict of interests**

375 MZ is funded by NHMRC Early Career Fellowship. KDH is supported by an Australian
376 Research Council Future Fellowship and an Honorary National Heart Foundation of Australia
377 Future Leader Fellowship. All authors declare no conflict of interest.

378

379

380 **References**

- 381 1. Chrestani MA, Santos IS, Horta BL, Dumith SC, de Oliveira Dode MA. Associated factors
382 for accelerated growth in childhood: a systematic review. *Matern Child Health J.* 2013; 17:512-
383 519.
- 384 2. Hill JO, Melanson EL. Overview of the determinants of overweight and obesity: current
385 evidence and research issues. *Med Sci Sports Exerc.* 1999; 31:S515-521.
- 386 3. Woo Baidal JA, Locks LM, Cheng ER, Blake-Lamb TL, Perkins ME, Taveras EM. Risk
387 Factors for Childhood Obesity in the First 1,000 Days: A Systematic Review. *Am J Prev Med.*
388 2016; 50:761-779.
- 389 4. Monteiro PO, Victora CG. Rapid growth in infancy and childhood and obesity in later
390 life--a systematic review. *Obes Rev.* 2005; 6:143-154.
- 391 5. Ong KK, Loos RJ. Rapid infancy weight gain and subsequent obesity: systematic reviews
392 and hopeful suggestions. *Acta Paediatr.* 2006; 95:904-908.
- 393 6. Zheng M, Lamb KE, Grimes C, Laws R, Bolton K, Ong KK, et al. Rapid weight gain
394 during infancy and subsequent adiposity: a systematic review and meta-analysis of evidence.
395 *Obes Rev.* 2018; 19:321-332.
- 396 7. Williams CB, Mackenzie KC, Gahagan S. The effect of maternal obesity on the offspring.
397 *Clin Obstet Gynecol.* 2014; 57:508-515.
- 398 8. Stettler N, Iotova V. Early growth patterns and long-term obesity risk. *Curr Opin Clin Nutr*
399 *Metab Care.* 2010; 13:294-299.
- 400 9. Yu Z, Han S, Zhu J, Sun X, Ji C, Guo X. Pre-pregnancy body mass index in relation to
401 infant birth weight and offspring overweight/obesity: a systematic review and meta-analysis.

402 *PLoS One*. 2013; 8:e61627.

403 10. Newton S, Braithwaite D, Akinyemiju TF. Socio-economic status over the life course and
404 obesity: Systematic review and meta-analysis. *PLoS One*. 2017; 12:e0177151.

405 11. Russell CG, Russell A. Biological and Psychosocial Processes in the Development of
406 Children's Appetitive Traits: Insights from Developmental Theory and Research. *Nutrients*.
407 2018; 10.

408 12. Campbell K, Hesketh K, Crawford D, Salmon J, Ball K, McCallum Z. The Infant Feeding
409 Activity and Nutrition Trial (INFANT) an early intervention to prevent childhood obesity:
410 cluster-randomised controlled trial. *BMC Public Health*. 2008; 8:103.

411 13. Hesketh KD, Campbell K, Salmon J, McNaughton SA, McCallum Z, Cameron A, et al.
412 The Melbourne Infant Feeding, Activity and Nutrition Trial (InFANT) Program follow-up.
413 *Contemp Clin Trials*. 2013; 34:145-151.

414 14. Campbell KJ, Hesketh KD, McNaughton SA, Ball K, McCallum Z, Lynch J, et al. The
415 extended Infant Feeding, Activity and Nutrition Trial (InFANT Extend) Program: a cluster-
416 randomized controlled trial of an early intervention to prevent childhood obesity. *BMC Public*
417 *Health*. 2016; 16:166.

418 15. Campbell KJ, Lioret S, McNaughton SA, Crawford DA, Salmon J, Ball K, et al. A parent-
419 focused intervention to reduce infant obesity risk behaviors: a randomized trial. *Pediatrics*.
420 2013; 131:652-660.

421 16. WHO Multicentre Growth Reference Study Group. WHO Child Growth Standards:
422 Length/height-for-age, weight-for-age, weight-for-length, weight-for-height and body mass
423 index-for-age: Methods and development. . Geneva: World Health Organization; 2006.

- 424 17. Furlong KR, Anderson LN, Kang H, Lebovic G, Parkin PC, Maguire JL, et al. BMI-for-
425 Age and Weight-for-Length in Children 0 to 2 Years. *Pediatrics*. 2016; 138.
- 426 18. Tilling K, Macdonald-Wallis C, Lawlor DA, Hughes RA, Howe LD. Modelling childhood
427 growth using fractional polynomials and linear splines. *Ann Nutr Metab*. 2014; 65:129-138.
- 428 19. Johnson W, Balakrishna N, Griffiths PL. Modeling physical growth using mixed effects
429 models. *Am J Phys Anthropol*. 2013; 150:58-67.
- 430 20. Katz M. *Multivariable Analysis: A practical guide for clinicians*. New York: Cambridge
431 University Press; 1999.
- 432 21. StataCorp. *Stata Statistical Software: Release 14*. College Station: TX: StataCorp LLC
433 2015.
- 434 22. Hayati Rezvan P, Lee KJ, Simpson JA. The rise of multiple imputation: a review of the
435 reporting and implementation of the method in medical research. *BMC Med Res Methodol*.
436 2015; 15:30.
- 437 23. White IR, Royston P, Wood AM. Multiple imputation using chained equations: Issues and
438 guidance for practice. *Stat Med*. 2011; 30:377-399.
- 439 24. Lee KJ, Carlin JB. Multiple imputation for missing data: fully conditional specification
440 versus multivariate normal imputation. *Am J Epidemiol*. 2010; 171:624-632.
- 441 25. Little R, Rubin D. *Statistical analysis with missing data*. Second Edition ed.: John Wiley
442 & Sons, Inc. ; 2002.
- 443 26. Villanueva EV. The validity of self-reported weight in US adults: a population based cross-
444 sectional study. *BMC Public Health*. 2001; 1:11.
- 445 27. Karaolis-Danckert N, Buyken AE, Kulig M, Kroke A, Forster J, Kamin W, et al. How pre-

- 446 and postnatal risk factors modify the effect of rapid weight gain in infancy and early childhood
447 on subsequent fat mass development: results from the Multicenter Allergy Study 90. *Am J Clin*
448 *Nutr.* 2008; 87:1356-1364.
- 449 28. Karaolis-Danckert N, Buyken AE, Bolzenius K, Perim de Faria C, Lentze MJ, Kroke A.
450 Rapid growth among term children whose birth weight was appropriate for gestational age has
451 a longer lasting effect on body fat percentage than on body mass index. *Am J Clin Nutr.* 2006;
452 84:1449-1455.
- 453 29. Pryor LE, Tremblay RE, Boivin M, Touchette E, Dubois L, Genolini C, et al.
454 Developmental trajectories of body mass index in early childhood and their risk factors: an 8-
455 year longitudinal study. *Arch Pediatr Adolesc Med.* 2011; 165:906-912.
- 456 30. Linabery AM, Nahhas RW, Johnson W, Choh AC, Towne B, Odegaard AO, et al. Stronger
457 influence of maternal than paternal obesity on infant and early childhood body mass index: the
458 Fels Longitudinal Study. *Pediatr Obes.* 2013; 8:159-169.
- 459 31. Xie C, Wang Y, Li X, Wen X. Childhood Growth Trajectories of Etiological Subgroups
460 of Large for Gestational Age Newborns. *J Pediatr.* 2016; 170:60-66 e61-65.
- 461 32. Imdad A, Yakoob MY, Bhutta ZA. Impact of maternal education about complementary
462 feeding and provision of complementary foods on child growth in developing countries. *BMC*
463 *Public Health.* 2011; 11 Suppl 3:S25.
- 464 33. Sharma D, Shastri S, Sharma P. Intrauterine Growth Restriction: Antenatal and Postnatal
465 Aspects. *Clin Med Insights Pediatr.* 2016; 10:67-83.
- 466 34. Ibanez L, Ferrer A, Marcos MV, Hierro FR, de Zegher F. Early puberty: rapid progression
467 and reduced final height in girls with low birth weight. *Pediatrics.* 2000; 106:E72.

- 468 35. Howe LD, Tilling K, Galobardes B, Smith GD, Gunnell D, Lawlor DA. Socioeconomic
469 differences in childhood growth trajectories: at what age do height inequalities emerge? *J*
470 *Epidemiol Community Health*. 2012; 66:143-148.
- 471 36. Van Den Berg G, Van Eijsden M, Galindo-Garre F, Vrijkotte T, Gemke R. Low maternal
472 education is associated with increased growth velocity in the first year of life and in early
473 childhood: the ABCD study. *Eur J Pediatr*. 2013; 172:1451-1457.
- 474 37. Kim S, Macaskill P, Baur LA, Hodson EM, Daylight J, Williams R, et al. The differential
475 effect of socio-economic status, birth weight and gender on body mass index in Australian
476 Aboriginal Children. *Int J Obes (Lond)*. 2016; 40:1089-1095.
- 477

Table 1. Summary of maternal and child characteristics by study cohorts

Characteristics	InFANT	InFANT Extend
Total sample (n)	527	450
Intervention (%)	49.9	52.4
Maternal characteristics		
Country of birth		
Australian born (%)	78.9	75.8
Overseas born (%)	20.9	23.1
Missing (%)	0.2	1.1
Education		
Low (%)	45.9	41.3
High (%)	54.1	57.3
Missing (%)	0.0	1.3
Pre-pregnancy BMI		
Healthy weight (% $\leq 25\text{kg/m}^2$)	63.8	58.5
Overweight/Obese (% $> 25\text{kg/m}^2$)	35.3	35.1
Missing (%)	0.9	6.4
Height		
Short (% \leq average)	46.1	51.1
Tall (% $>$ average)	53.7	43.3
Missing (%)	0.2	5.6
Gestational age (weeks)	38.8(2.4)	39.1(1.9)
Child characteristics		
Boys (%)	53.1	53.8
Birth weight (kg)	3.4(0.6)	3.4(0.6)
Birth height (cm)	50.0(2.7)	50.3(2.6)
Rapid weight gain from birth to 3 months		
Rapid weight gain (%)	14.4	13.8
Number of children at each follow-up		
T1 (3 months)	527	450
T2 (9months)	518	386
T3 (18months)	469	356
T4 (36/42months)	361	344
Number of BAZ/HAZ measurement		
2	9	41
3	37	39
4	144	103
5	337	267

*Maternal height average: 164.5cm

Table 2 Mixed effect polynomial model between association of early postnatal rapid growth, maternal factors, and trajectories of body mass index for age z-score (BAZ) and height for age z-score (HAZ) from ages 3 to 42 months (n=3065 observations).

	BAZ	HAZ
	$\beta(95\%CI)$	$\beta(95\%CI)$
Age	0.15(0.13,0.16)	-0.07(-0.08,-0.05)
Age ²	-0.002(-0.003,-0.002)	0.001(0.001,0.002)
Maternal education (low)	0.03(-0.07,0.13)	0.09(-0.02,0.19)
Maternal pre-pregnancy OW/OB	0.17(0.07,0.28)	-
Maternal height (>average)	-	0.34(0.23,0.44)
Maternal country of birth (Australia)	-0.05(-0.23,0.12)	-0.23(-0.41,-0.05)
Maternal country of birth (Australia) x Age	0.02(0.004,0.04)	0.03(0.01,0.05)
Maternal country of birth (Australia) x Age ²	-0.0004(-0.001,-0.00002)	-0.001(-0.001,-0.0002)
Rapid growth	1.53(1.31,1.75)	-0.01(-0.24,0.21)
Rapid growth x Age	-0.07(-0.09,-0.05)	0.07(0.05,0.09)
Rapid growth x Age ²	0.001(0.001,0.002)	-0.001(-0.002,-0.001)
Constant	-0.62(-1.74,0.51)	-0.07(-1.18,1.32)

OW/OB (overweight/obese): body mass index $>25\text{kg}/\text{m}^2$; Maternal height average: 164.5cm. The reference categories are maternal high education, maternal healthy weight, maternal height \leq average, maternal not Australian born, and children without rapid growth. All variables were included in the same model as fixed effects and the model adjusted for child sex, intervention group, study cohorts, gestational age, and BAZ or HAZ at birth and included parent group and age as random effects. The β of age represents rate of growth (increase $+\beta$, decrease $-\beta$) and β of age² represents acceleration ($+\beta$) or deceleration ($-\beta$) of growth, which determines the curvilinear shape of the growth trajectory. Interaction terms with age and age² allows rate of change in BAZ to vary this factor. Maternal education and OW/OB or height with age and age² interactions were not associated with the outcome, thus excluded from the model

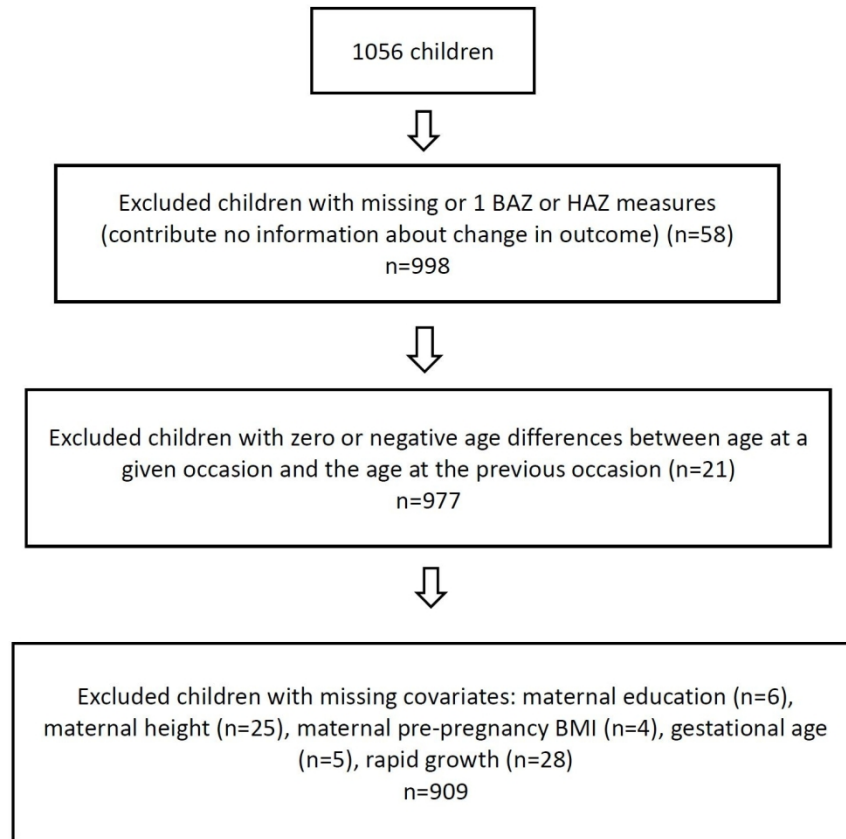


Figure 1 Flow chart showing the number participants included in the final analysis.

205x174mm (216 x 216 DPI)

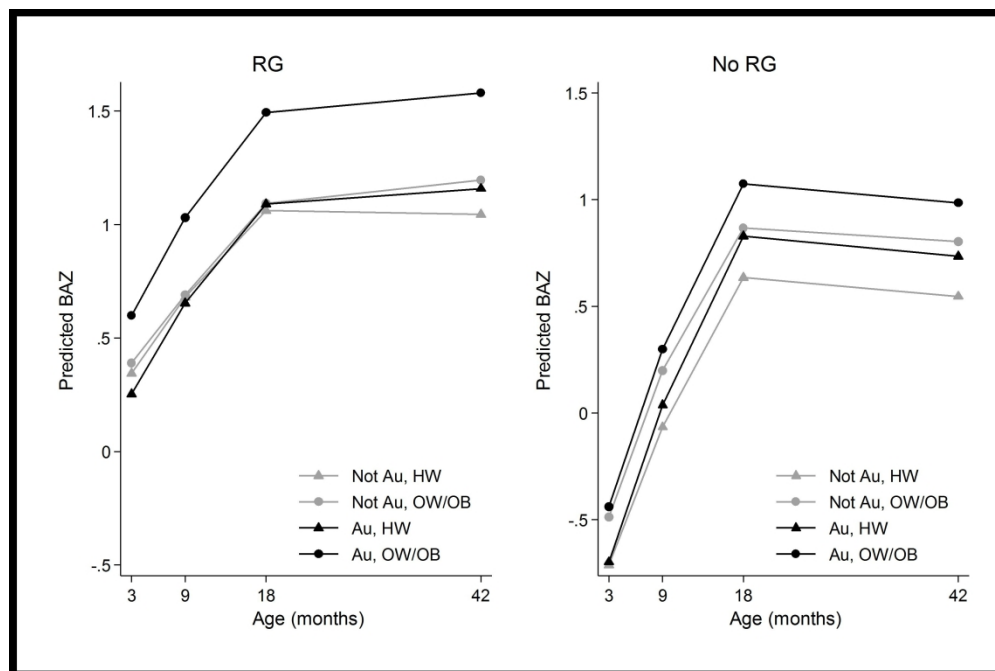


Figure 2 Predicted mean body mass index for age z-score (BAZ) trajectory from 3 to 42 months by maternal country of birth (Au: Australia, Not Au: Not Australia), maternal pre-pregnancy BMI (HW: healthy weight; OW/OB: overweight/obesity), RG (rapid growth) from multivariable mixed effect polynomial model with adjustment for child sex, intervention group, study cohorts, gestational age and BAZ at birth.

430x288mm (216 x 216 DPI)

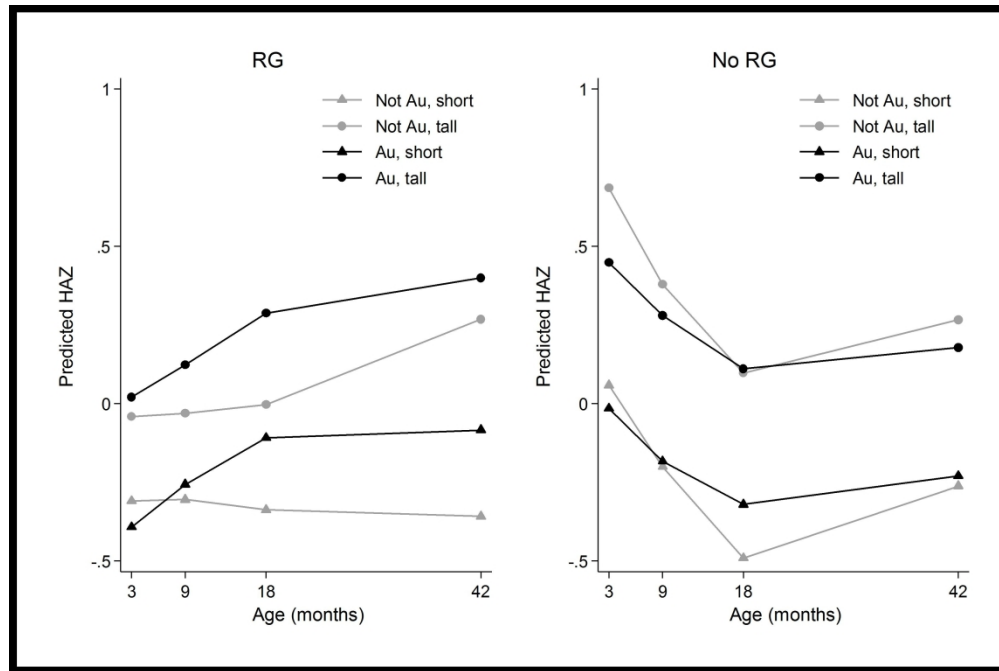


Figure 3 Predicted mean height for age z-score (HAZ) trajectory from 3 to 42 months by maternal country of birth (Au: Australia, Not Au: Not Australia), maternal height (Short \leq average height 164.5cm; Tall $>$ average height 164.5cm), RG (rapid growth) from multivariable mixed effect polynomial model with adjustment for child sex, intervention group, study cohorts, gestational age and HAZ at birth.

430x288mm (216 x 216 DPI)

Supplementary Table 1. Comparison of excluded vs included in the analysis*

Characteristics	Included	Excluded
Intervention (%)	51.1	46.2
Maternal characteristics		
Country of birth		
Australian born (%)	78.22	72.92
Overseas born (%)	21.8	27.1
Education		
Low (%)	43.8	48.4
High (%)	56.2	51.6
Pre-pregnancy BMI		
Healthy weight (% $\leq 25\text{kg/m}^2$)	63.2	74.6
Overweight/Obese (% $>25\text{kg/m}^2$)	36.8	25.4
Height		
Short (% \leq average)	49.3	57.0
Tall (% $>$ average)	50.7	43.0
Gestational age (weeks)	38.9 (2.1)	38.7 (3.0)
Child characteristics		
Boys (%)	53.0	47.8
Birth weight (kg)	3.4(0.6)	3.3(0.5)
Birth height (cm)	50.1(2.7)	50.1(25)
Rapid weight gain from birth to 3 months		
Rapid weight gain (%)	15.0	11.5

*n ranged from 63 to 147 for those excluded from the analysis.

*n =909 for those included in the analysis

Supplementary Table 2 Sensitivity analysis of mixed effect polynomial model between association of early postnatal rapid growth, maternal factors, and body mass index for age z-score (BAZ) trajectories from ages 3 to 42 months using multiple imputation with 50 imputations (n=3912 observations).

	BAZ	HAZ
	$\beta(95\%CI)$	$\beta(95\%CI)$
Age	0.15(0.13,0.16)	-0.07(-0.08,-0.05)
Age ²	-0.003(-0.003,-0.002)	0.001(0.001,0.002)
Maternal education (low)	0.03(-0.07,0.13)	0.08(-0.02,0.18)
Maternal pre-pregnancy OW/OB	0.2(0.09,0.30)	-
Maternal height (>average)	-	0.39(0.29,0.50)
Maternal country of birth (Australia)	-0.03(-0.19,0.14)	-0.27(-0.44,-0.10)
Maternal country of birth (Australia) x Age	0.02(0.003,0.04)	0.03(0.01,0.04)
Maternal country of birth (Australia) x Age ²	-0.0004(-0.001,-0.00002)	-0.001(-0.001,-0.0002)
Rapid growth	1.48(1.27,1.70)	-0.02(-0.24,0.21)
Rapid growth x Age	-0.07(-0.09,-0.05)	0.06(0.04,0.08)
Rapid growth x Age ²	0.001(0.001,0.002)	-0.001(-0.002,-0.001)
Constant	-0.79(-1.84,0.27)	-0.19(-1.42,1.04)

OW/OB (overweight/obese): body mass index $>25\text{kg/m}^2$; Maternal height average: 164.5cm. The reference

categories are maternal high education, maternal healthy weight, maternal height \leq average, maternal not Australian born, and children without rapid growth. All variables were included in the same model as fixed effects and the model adjusted for child sex, intervention group, study cohorts, gestational age, and BAZ or HAZ at birth and included parent group and age as random effects. Maternal education and OW/OB or height with age and age² interactions were not associated with the outcome, thus excluded from the model.

Supplementary Table 3: Mixed effect polynomial model between associations of early postnatal rapid growth, maternal factors, and trajectories of body mass index for age z-score (BAZ) and height for age z-score (HAZ) from ages 3 to 42 months by intervention group.

	BAZ		HAZ	
	Control β (95%CI)	Intervention β (95%CI)	Control β (95%CI)	Intervention β (95%CI)
Age	0.16(0.13,0.18)	0.14(0.12,0.16)	-0.07(-0.09,-0.05)	-0.06(-0.08,-0.04)
Age ²	-0.003(-0.003,-0.002)	-0.002(-0.003,-0.002)	0.001(0.001,0.002)	0.001(0.001,0.002)
Maternal education (low)	0.02(-0.02,0.27)	0.05(-0.18,0.09)	0.07(-0.09,0.23)	0.08(-0.07,0.23)
Maternal pre-pregnancy OW/OB	0.19(0.04,0.34)	0.18(0.04,0.33)	-	-
Maternal height (>average)	-	-	0.4(0.24,0.55)	0.3(0.15,0.45)
Maternal Australia born	-0.06(-0.21,0.31)	-0.05(-0.40,0.10)	-0.34(-0.6,-0.07)	-0.14(-0.39,0.11)
Maternal Australia born x Age	0.01(-0.02,0.04)	0.03(0.01,0.06)	0.03(0.01,0.06)	0.02(-0.0003,0.05)
Maternal Australia born x Age ²	-0.0002(-0.0007,0.0004)	-0.0006(-0.0011,-0.0001)	-0.001(-0.001,-0.0001)	-0.0005(-0.001,0.00005)
Rapid growth	1.63(1.27,2)	1.44(1.15,1.73)	-0.07(-0.44,0.29)	-0.01(-0.3,0.29)
Rapid growth x Age	-0.06(-0.1,-0.02)	-0.07(-0.1,-0.05)	0.06(0.02,0.09)	0.07(0.05,0.1)
Rapid growth x Age ²	0.001(0.0003,0.002)	0.001(0.001,0.002)	-0.001(-0.002,-0.0002)	-0.001(-0.002,-0.001)

OW/OB (overweight/obese): body mass index >25kg/m²; Maternal height average: 164.5cm. The reference categories are maternal high education, maternal healthy weight, maternal height \leq average, maternal not Australian born, and children without rapid growth. All variables were included in the same model as fixed effects and the model adjusted for child sex, intervention group, study cohorts, gestational age, and BAZ or HAZ at birth and included parent group and age as random effects.