

ARTICLE



The mediation effect of breastfeeding duration on the relationship between maternal preconception BMI and childhood nutritional risk

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BACKGROUND: Higher maternal preconception body mass index (BMI) is associated with lower breastfeeding duration, which may contribute to the development of poor child eating behaviours and dietary intake patterns (components of nutritional risk). A higher maternal preconception BMI has been found to be associated with higher child nutritional risk. This study aimed to determine whether breastfeeding duration mediated the association between maternal preconception BMI and child nutritional risk.

METHODS: In this longitudinal cohort study, children ages 18 months to 5 years were recruited from The Applied Research Group for Kids (TARGet Kids!) in Canada. The primary outcome was child nutritional risk, using The NutriSTEP[®], a validated, parent-reported questionnaire. Statistical mediation analysis was performed to assess whether total duration of any breastfeeding mediated the association between maternal preconception BMI and child nutritional risk.

RESULTS: This study included 4733 children with 8611 NutriSTEP[®] observations. The mean (SD) maternal preconception BMI was 23.6 (4.4) and the mean (SD) breastfeeding duration was 12.4 (8.0) months. Each 1-unit higher maternal preconception BMI was associated with a 0.081 unit higher nutritional risk (95% CI (0.051, 0.112); $p < 0.001$) (total effect), where 0.011 (95% CI (0.006, 0.016); $p < 0.001$) of that total effect or 13.18% (95% CI: 7.13, 21.25) was mediated through breastfeeding duration.

CONCLUSION: Total breastfeeding duration showed to mediate part of the association between maternal preconception BMI and child nutritional risk. Interventions to support breastfeeding in those with higher maternal preconception BMI should be evaluated for their potential effect in reducing nutritional risk in young children.

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INTRODUCTION

Maternal body mass index (BMI) in the preconception period has been shown to be an important determinant of breastfeeding success. Higher preconception BMI has been associated with lower breastfeeding initiation rates and shorter duration of both exclusive breastfeeding and any breastfeeding [1–4]. Mothers with lower income, a key factor found to be associated with obesity [5], are similarly less likely to breastfeed for longer durations [6, 7].

Children who are breastfed longer are more likely to develop optimal healthy eating patterns and behaviours in early childhood [8–11], with research suggesting the greatest benefit when a child is breastfed up to 12 months or longer [12–15]. Poor nutrition in early childhood is itself a risk factor for obesity in later childhood and the development of non-communicable diseases such as type 2 diabetes [16, 17]. Healthy eating behaviours developed early in

life have been shown to persist into adulthood, highlighting the importance of identifying nutritional risk and protective factors in young children [16, 18].

Higher maternal BMI, independent of the preconception period, has been found to be associated with eating behaviours and child dietary intake patterns low in fruits and vegetables [19, 20], while lower maternal BMI has shown to be associated with child dietary patterns higher in fruits, vegetables and other healthy foods [21]. Research examining maternal BMI specifically during the preconception period has similarly found higher BMI to be associated with poor child dietary patterns high in sugary foods and sweetened beverages [22].

Recent research from our group found that higher maternal preconception BMI was associated with higher nutritional risk in young children [23]. However, the mechanisms for this association

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are poorly understood, leaving gaps in knowledge on how to best support women with higher preconception BMIs with optimising their child's nutritional health. Breastfeeding duration may be a mediator on the causal pathway between maternal preconception BMI and child nutritional risk, in which case supportive breastfeeding programs designed specifically for women with increased preconception BMI could be a promising strategy for improving child nutritional outcomes.

The primary objective of this study was to determine if total duration of any breastfeeding mediates the association between maternal preconception BMI and nutritional risk in children 18 months to 5 years of age. Secondary objectives included determining if total breastfeeding duration mediates the association between preconception maternal BMI and child eating behaviours and dietary intake patterns, and whether each of these associations varies by household income. It was hypothesised that total duration of any breastfeeding is a mediator of the association between maternal preconception BMI and child nutritional risk, eating behaviours and dietary intake, where mothers with lower household income may experience different mediating effects compared to higher income groups.

SUBJECTS AND METHODS

Study design and participants

This study included children enrolled in the TARGet Kids! practice-based research network in Canada. TARGet Kids! recruits children up to 5 years of age and collects longitudinal data at primary care visits [24]. Children were excluded at enrolment who have health conditions affecting growth, chronic condition(s) (excluding asthma), and severe developmental delay. Questionnaires were offered to parents to collect data on sociodemographics, health history, and child nutritional risk. Child and parent anthropometrics were also obtained, including weight, and length, or height, as appropriate by age, using standard practices [25].

This study included children from the TARGet Kids! cohort that were between the ages of 18 months to 5 years, who had completed at least one NutriSTEP[®] questionnaire and whose mother had a measured or self-reported preconception BMI. The Research Ethics Boards at the Hospital for Sick Children and St. Michael's Hospital both approved this study. Parents of the children eligible and participating in the study provided consent prior to participating. This study can be found online at clinicaltrials.gov registered under NCT01869530.

Exposure

The primary exposure was maternal preconception BMI, defined as any BMI value ($BMI = \text{weight}(\text{kg})/\text{height}^2(\text{m}^2)$) recorded within the 2 years prior to becoming pregnant, either measured in clinic or self-reported. Measured weight was obtained when the mother came to a clinic visit with an older sibling already enrolled in TARGet Kids!, prior to becoming pregnant with the child in this study analysis (ensured to be measured at 37 weeks or more prior to the second child's birth date). If a mother did not have her weight measured during preconception, a retrospective self-reported weight was obtained from the study questionnaire. A mother could have had her height measured in clinic each time they accompanied their child to a clinic visit; therefore, the median height of all measures was used in the BMI calculation.

Outcomes

Study outcomes were derived from the NutriSTEP[®] questionnaire, a parent-reported and validated tool used to measure nutritional risk in children ages 18 months to 5 years, with age specific versions for toddlers (18 to <36 months) and preschoolers (3–5 years) [26, 27]. The primary outcome was nutritional risk, determined from the total NutriSTEP[®] score, composed of 17 questions on the child's usual dietary intake, screen time, physical activity, specific eating behaviours, and parent perceptions of growth [26, 27]. The total score ranges from 0 to 68, where a score < 21 is considered low nutritional risk, 21–25 is moderate nutritional risk, and ≥ 25 is high nutritional risk [26]. For simplicity, study baseline characteristics dichotomised the NutriSTEP[®] score, resulting in a low-risk (<21) and high-risk score (≥ 21).

Two sub-scale scores from the questionnaires have been used to study the nutritional risk domains of child eating behaviours and dietary intake [13, 28]. The eating behaviour sub-scale score was comprised of five questions for a score of 0–20 for preschoolers and seven questions for a score of 0–28 for toddlers. The dietary intake sub-scale score was made up of six questions for a score of 0–24 for both toddler and preschooler versions. All analyses with the sub-scale scores were stratified by toddler and preschooler age groups, to understand differences among these two age ranges.

Mediator

The mediator was total breastfeeding duration, defined as total duration in months of the provision of any breast milk, and was self-reported as a categorical variable: 0 months, 0 to <6 months, 6 to <12 months, 12 to <18 months, and ≥ 18 months. These categories were selected a priori, and were consistent with previous work by our team and others [13]. A categorical variable was used to account for right-censoring beyond 18 months, as a child could still be receiving breast milk when the NutriSTEP[®] was measured. To our knowledge, methods for censored continuous time-to-event variables as mediators do not currently exist; however, it is possible to include these variables in a mediation model by transforming the mediator into a categorical variable [29, 30]. Total duration of any breastfeeding was chosen, rather than rates of breastfeeding initiation, exclusivity or discontinuation in order to be consistent with previous literature which has shown that total breastfeeding duration is associated with multiple outcomes in child nutrition [12, 13, 15], and studies that evaluated the effect of both exclusive and total breastfeeding, found similar results for each [14].

Covariates

The confounders were determined a priori based on previous literature to align with the specific confounding assumptions for mediation analyses [29]. Confounders included in the model were child age [18], self-reported annual household income (CAD\$) [5, 31], maternal age [32, 33], maternal ethnicity [34, 35], and parity [36, 37]. Maternal age was recorded as the age when the preconception BMI was measured, or self-reported. Child age was recorded in months at the time when NutriSTEP[®] was completed. Based on previous literature examining income, maternal BMI and breastfeeding duration, we decided a priori to stratify the model by household income <\$80 000 and \geq \$80 000, using the median total household income for the Greater Toronto Area, in Canada [38].

Statistics

Descriptive statistics for the model exposure, outcomes, mediator, and covariates, with additional sociodemographic variables of both the mothers and children were completed. Means with standard deviations or proportions with percentages of each variable were reported for the whole sample and then stratified by maternal preconception BMI < 25 kg/m² and ≥ 25 kg/m². Data cleaning involved removing any BMI outliers according to a previously published protocol used for adult anthropometrics [39]. Any NutriSTEP[®] questionnaires that were completed when the child was outside of the age range for which the questionnaire had been validated for were also removed from the sample [26, 27]. All model covariates had <15% missingness. Multiple imputations were completed with 15 imputed data sets using the *mice* package in R to impute missing values of covariates assuming they were missing at random (MAR), or missing completely at random (MCAR) [40]. Under the MAR assumption, we assume a child with a higher or lower NutriSTEP score was not more or less likely to have a NutriSTEP[®] completed, conditional on the other covariates and variables in the imputation model.

To estimate the mediation effect of different breastfeeding duration categories on the association between maternal preconception BMI and child nutritional risk, the total effect, direct effect, indirect effect, and proportion mediated were calculated with 95% confidence intervals [29, 30], conceptual model shown in Fig. 1. The total effect represents the complete effect that the exposure has on each of the outcomes [30]. The direct effect, represents the effect on the outcome that is not due to the mediator, and can often include intermediates that are not measured in the analysis [30]. The indirect effect or otherwise known as the mediation effect, is the effect on the outcome due to the exposure, via the mediator [30]. Proportion mediated was calculated by dividing the indirect effect by the total effect, where non parametric bootstrap methods were used to bootstrap the model 100 times per imputed dataset, for a total of 1500

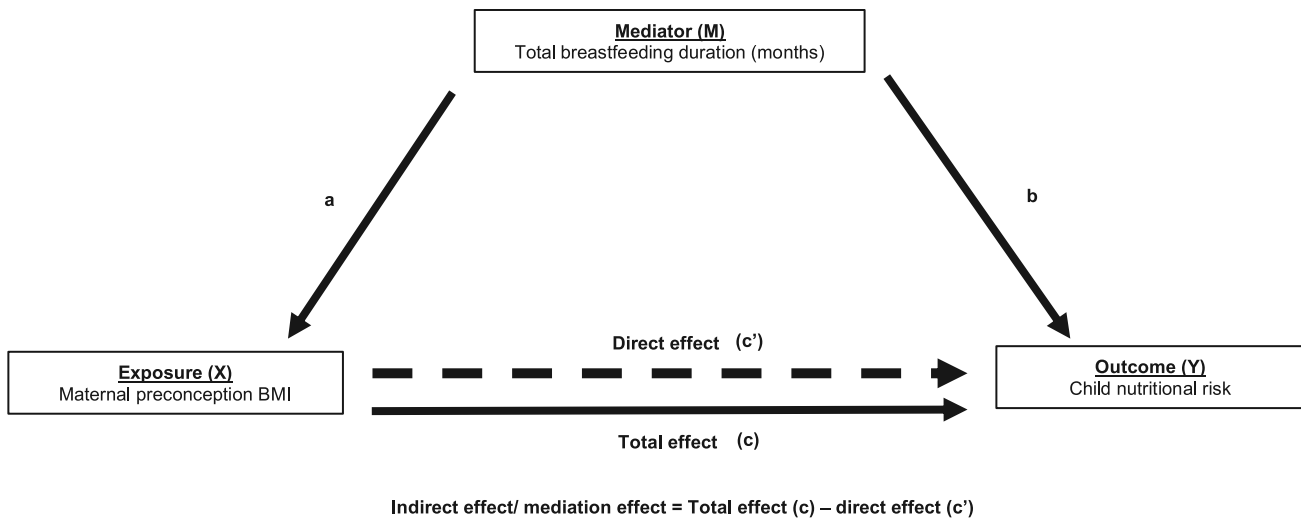


Fig. 1 Mediation analysis conceptual model.

bootstrap samples, to obtain the 95% confidence intervals for the proportion mediated values [30]. Within each of the 100 bootstrap samples, Rubin's rules were used to pool the 15 proportion mediated estimates [41].

This mediation analysis used methods described by Steen et al. through the R package medflex [42]. To account for the chance that an exposure-mediator interaction may be present, models were fit and compared, with and without an interaction term between breastfeeding duration and maternal preconception BMI, with results compared at each maternal preconception BMI quantile of 25%, 50%, and 75%. The mediation analyses were fit for each of the outcomes: total nutritional risk score, eating behaviour sub-scale score and dietary intake sub-scale score, where the two sub-scale scores were stratified by age according to each version of the NutriSTEP[®] (toddlers 18 to <36 months and preschoolers 36 to <72 months) to account for potentially differing associations in each NutriSTEP[®] score. Lack of independence between NutriSTEP[®] observations on the same child was accounted for using robust "sandwich" estimates of the variances [43]. A separate multinomial model was also fit to examine the association between maternal preconception BMI and each breastfeeding duration category.

A secondary analysis was completed where all models were stratified by household income <\$80,000 and ≥\$80,000, as decided a priori, to account for potential effect modification. Residual plots were assessed to ensure that all model assumptions for linearity, and normality of residuals, and influential observations were met. All *p*-values that were < 0.05, along with 95% confidence intervals were used to determine statistically significant results. All statistical analyses were completed in R for Mac, version 4.1.1 [44].

RESULTS

This study included 4733 children, coming from 4440 families, with 1–3 kids per family, with 8611 NutriSTEP[®] observations. Overall, the children had a mean (SD) age of 35.3 (14.5) months and 51.7% were male sex. The mean (SD) maternal preconception BMI was 23.6 (4.4) and using the WHO BMI classifications indicated that 3.9% of the sample had an underweight BMI, 69.2% had normal weight, 19.1% had overweight, and 7.8% had obesity [45]. The mean (SD) NutriSTEP[®] total score at baseline, for both toddlers and preschoolers combined was 13.8 (6.4) (*n* = 4733), with 12.5 (6.0) (*n* = 2017) for toddlers, and 14.8 (6.6) (*n* = 2716) for preschoolers. The mean (SD) duration of any breastfeeding was 12.4 (8.0) months, where those with a preconception BMI < 25 kg/m² (*n* = 3460) had a mean (SD) duration of 12.6 (7.7) months, and those with a preconception BMI ≥ 25 kg/m² (*n* = 1273) had a mean (SD) duration of 12.0 (8.80) months (Table 1).

When testing for an exposure-mediator interaction between maternal preconception BMI and breastfeeding duration, the total

natural direct and pure direct effects, and the total natural indirect and pure indirect effects had similar values with very slight deviations from each other (Supplementary Table 5). This provided sufficient evidence to remove the interaction term in all subsequent models [30].

The multinomial model examining the relationship between maternal preconception BMI and breastfeeding duration category is displayed in Fig. 2. From a multinomial model, there was strong evidence that maternal preconception BMI was associated with breastfeeding duration category (*p* < 0.001), after adjusting for age, family income, number of siblings, maternal age, and maternal ethnicity, where individual odds ratios and 95% confidence intervals are included as a supplement (Supplementary Table 6). Overall, the probabilities for the longer breastfeeding duration categories (>6 months) showed that higher preconception BMI was associated with shorter total breastfeeding duration.

The primary mediation analysis showed that each 1-unit higher maternal preconception BMI was associated with a 0.081 (95% CI (0.051, 0.112); *p* < 0.001) unit (total effect) higher nutritional risk, where 0.011 (95% CI (0.006, 0.016); *p* < 0.001) (mediation effect) of that total effect was mediated through breastfeeding duration (Table 2). This translates to the proportion mediated through breastfeeding duration being ~13.18% (95% CI (7.13, 21.25)) in both toddlers and preschoolers combined. When results were stratified by age, for preschoolers, each 1-unit higher maternal preconception BMI was associated with a 0.10 (95% CI (0.06, 0.14); *p* < 0.001) unit higher nutritional risk, where 0.010 (95% CI (0.004, 0.016); *p* < 0.001) of that total effect was mediated through breastfeeding duration, with a proportion mediated of 10.06% (95% CI (5.72, 20.09)). For toddlers, while there was evidence of a total effect (0.049; 95% CI (0.003, 0.095; *p* = 0.035)), there was insufficient evidence for a natural direct effect (*p* = 0.081), or indirect effect (*p* = 0.051), and therefore we are unable to conclude if there is a mediation effect in this sub-group.

For the preschoolers, each 1-unit higher maternal preconception BMI was associated with a 0.032 (95% CI (0.018, 0.045); *p* < 0.001) unit higher in eating behaviour sub-scale score, where 0.004 (95% CI (0.002, 0.006); *p* < 0.001) of that total effect was mediated through breastfeeding duration, with a proportion mediated of 11.88% (95% CI (7.08, 24.06)). For the dietary intake sub-scale score in preschoolers, each 1-unit higher maternal preconception BMI was associated with a 0.050 (95% CI (0.029, 0.071); *p* < 0.001) unit higher dietary intake sub-scale score, where 0.005 (95% CI (0.002, 0.007); *p* < 0.001) was mediated through breastfeeding duration, with a proportion mediated of 9.23% (95%

Table 1. Participant Characteristics^a.

Variable	n	Preconception BMI Weight Status Groups ^b		
		All Weight Status (n = 4733)	Underweight/Normal (n = 3460)	Overweight/Obese (n = 1273)
Child and Mother Baseline Characteristics (means ± SD or N(%))				
Male	4733	2448 (51.7)	1773 (51.2)	675 (53.0)
Child age at outcome, mo	4733	35.25 ± 14.52	35.63 ± 14.44	34.24 ± 14.70
Number of siblings,	4675			
mean (SD)		0.81 ± 0.79	0.80 ± 0.77	0.83 ± 0.83
0 n (%)		1747 (37.4)	1280 (37.4)	467 (37.4)
1		2239 (47.9)	1647 (48.1)	592 (47.4)
2		558 (11.9)	415 (12.1)	143 (11.5)
3		107 (2.3)	72 (2.1)	35 (2.8)
4		14 (0.3)	8 (0.2)	6 (0.5)
5		6 (0.1)	2 (0.1)	4 (0.3)
6		4 (0.1)	3 (0.1)	1 (0.1)
Mother Age, yr	4592	33.52 ± 4.51	33.52 ± 4.39	33.53 ± 4.83
Maternal Ethnicity, n (%)	4411			
European		2904 (65.8)	2182 (67.2)	722 (62.0)
East Asian		322 (7.3)	285 (8.8)	37 (3.2)
South/Southeast		489 (11.1)	339 (10.4)	150 (12.9)
Mixed Ethnicity		260 (5.9)	182 (5.6)	78 (6.7)
African		211 (4.8)	118 (3.6)	93 (8.0)
Other		225 (5.1)	141 (4.3)	84 (7.2)
Maternal Education	4684			
College/University		4345 (92.8)	3239 (94.4)	1106 (88.2)
High school or less		339 (7.2)	191 (5.6)	148 (11.8)
Self-Reported Income	4051			
\$0 to \$39,999		333 (8.2)	186 (6.3)	147 (13.1)
\$40,000 to \$79,999		574 (14.2)	360 (12.3)	214 (19.1)
\$80,000 to \$149,999		1270 (31.4)	907 (30.9)	363 (32.4)
\$150,000+		1874 (46.3)	1478 (50.4)	396 (35.4)
Mother Employed, yes	4675	3815 (81.6)	2828 (82.6)	987 (78.8)
Smoking during pregnancy, yes	4579	73 (1.6)	38 (1.1)	35 (2.8)
Gestational Diabetes, yes	4664	263 (5.6)	139 (4.1)	124 (10.0)
High blood pressure during pregnancy, yes	4650	265 (5.7)	142 (4.2)	123 (9.9)
Total Mean Breastfeeding duration, mo	4660	12.4 ± 8.0	12.6 ± 7.7	12.0 ± 8.8
Total BF Duration Categories, mo	4660			
0		203 (4.4)	118 (3.5)	85 (6.8)
>0-<6		634 (13.6)	416 (12.2)	218 (17.5)
≥6-<12		1297 (27.8)	981 (28.8)	316 (25.3)
≥12-<18		1371 (29.4)	1073 (31.5)	298 (23.9)
≥18		1155 (24.8)	823 (24.1)	332 (26.6)
Preconception maternal BMI	4733	23.6 ± 4.4	21.5 ± 1.9	29.0 ± 4.4
NutriSTEP® total score	4733	13.8 ± 6.4	13.4 ± 6.3	14.8 ± 6.7
Toddlers	2017	12.5 ± 6.0	12.1 ± 5.9	13.43 ± 6.3
Preschoolers	2716	14.8 ± 6.6	14.33 ± 6.4	16.09 ± 6.8
NutriSTEP® eating behaviour sub-scale score ³	4733			
Toddlers	2017	5.0 ± 3.0	5.0 ± 3.0	6.0 ± 3.0
Preschoolers	2716	4.0 ± 2.0	4.0 ± 2.0	4.0 ± 2.0
NutriSTEP® dietary intake sub-scale score	4733			
Toddlers	2017	6.0 ± 3.0	6.0 ± 3.0	6.0 ± 3.0
Preschoolers	2716	7.0 ± 3.0	7.0 ± 3.0	8.0 ± 4.0

^a Data is shown as means ± standard deviation or as n counts (%).

^bMaternal weight status was classified according to the World Health Organisation BMI categories, with underweight (below 18.5 kg/m²), normal weight (greater than or equal to 18.5 kg/m² to 24.9 kg/m²), overweight (greater than or equal to 25 kg/m² to 29.9 kg/m²) and obese (greater than or equal to 30 kg/m²) [45].

CI (4.66, 15.95)) (Table 3). There was insufficient evidence to conclude if there was a mediation effect for the eating behaviour sub-scale score in toddlers as seen with the *p*-values for the total effect (*p* = 0.087) and direct effect (*p* = 0.224). There was

insufficient evidence to conclude a mediation effect for the dietary intake sub-scale score in the toddler age group, where the *p*-values were >0.05 for the indirect effect (*p* = 0.195), direct effect (*p* = 0.152), and total effect (*p* = 0.098).

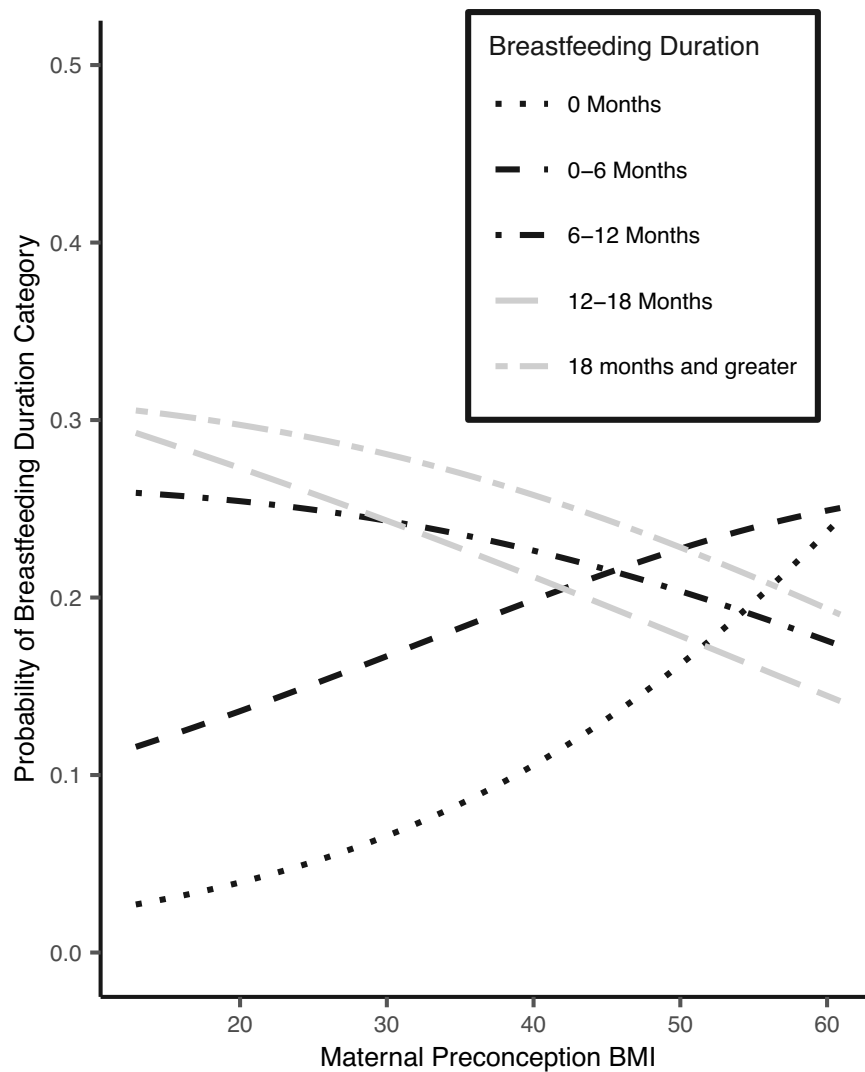


Fig. 2 Probability plot of breastfeeding duration category against maternal preconception BMI.

Table 2. Primary mediation of breastfeeding duration analysis results on total NutriSTEP® score.

	Total NutriSTEP® score all ages <i>n</i> = 4733		Total NutriSTEP® score stratified (Toddlers) <i>n</i> = 2017		Total NutriSTEP® score stratified (Preschoolers) <i>n</i> = 2716	
	Pooled Mean (95% CI)	<i>P</i> -value	Pooled Mean (95% CI)	<i>P</i> -value	Pooled Mean (95% CI)	<i>P</i> -value
Total Effect	0.081 (0.051, 0.112)	<0.001	0.049 (0.003, 0.095)	0.035	0.098 (0.059, 0.137)	<0.001
Natural Direct	0.070 (0.040, 0.100)	<0.001	0.040 (−0.005, 0.085)	0.081	0.088 (0.049, 0.127)	<0.001
Natural Indirect	0.011 (0.006, 0.016)	<0.001	0.009 (0.00, 0.019)	0.051	0.010 (0.004, 0.016)	<0.001
Proportion Mediated	13.18% (7.13, 21.25)		19.16% (2.24, 74.93)		10.06% (5.72, 20.09)	

When the mediation results were stratified by household income, 892 children fell into the lower income group (<\$80,000), while 3176 children fell into the higher income group (≥\$80,000). For the higher income group, each 1-unit higher maternal preconception BMI was associated with a 0.124 (95% CI (0.090, 0.159); $p < 0.001$) unit higher in NutriSTEP® total score, where 0.012 (95% CI (0.060, 0.018); $p < 0.001$) was mediated through breastfeeding duration, with a proportion mediated of 9.68% (Table 4). There was no evidence that these associations were present in the lower income group, where the total effect was estimated to be 0.032 (95% CI (−0.033, 0.096); $p = 0.336$) with

a mediation effect of 0.007 (95% CI (−0.004, 0.017); $p = 0.217$). When these results were further stratified by toddler and preschooler age groups, significant findings were found in the higher income group only (Supplementary Table 7).

DISCUSSION

This is the first study to examine breastfeeding duration as a mediator between preconception maternal BMI and early child nutritional risk. We found total duration of any breastfeeding mediated ~13.18% of the association between maternal

Table 3. Mediation of breastfeeding duration analysis results on total NutriSTEP® eating behaviour and dietary intake sub-scale scores.

	Eating-behaviour sub-scale score (Toddlers) (n = 2017)		Eating-behaviour sub-scale score (Preschoolers) (n = 2716)		Dietary intake sub-scale score (Toddlers) (n = 2017)		Dietary intake sub-scale score (Preschoolers) (n = 2716)	
	Pooled Mean (95% CI)	P-value	Pooled Mean (95% CI)	P-value	Pooled Mean (95% CI)	P-value	Pooled Mean (95% CI)	P-value
Total effect	0.021 (-0.003, 0.046)	0.087	0.032 (0.018, 0.045)	<0.001	0.017 (-0.003, 0.038)	0.098	0.050 (0.029, 0.071)	<0.001
Natural direct effect	0.015 (-0.009, 0.038)	0.224	0.028 (0.015, 0.041)	<0.001	0.015 (-0.005, 0.035)	0.152	0.045 (0.024, 0.066)	<0.001
Natural indirect effect	0.007 (0.002, 0.012)	0.009	0.004 (0.002, 0.006)	<0.001	0.002 (-0.001, 0.006)	0.195	0.005 (0.002, 0.007)	<0.001
Proportion Mediated	31.10% (5.66, 108.35)		11.88% (7.08, 24.06)		14.52% (-23.09, 81.78)		9.23% (4.66, 15.95)	

preconception BMI with nutritional risk in toddler and preschooler-aged children. When these results were stratified by age group, the mediation effect showed statistical significance in the preschooler age group only, with a proportion mediated of 10.06%. In the preschoolers, evidence of a mediation effect was found where breastfeeding accounted for ~11.88% of the association with eating behaviours and 9.23% of the association with dietary intake. Previous findings from our research team found that a higher maternal preconception BMI was associated with a higher child nutritional risk [23], while one other study found a higher preconception maternal BMI to be a predictor of poor dietary intake patterns in toddlers [22]. These findings are important clinically because providing breastfeeding support for women with higher preconception BMIs is a potential preventive opportunity to improve early child nutritional outcomes. Additionally, since total breastfeeding duration only partly mediated the overall effect, it suggests that there may be other potentially modifiable targets between preconception and early childhood which may help optimise child nutritional health. These targets may be similar to mechanisms seen in the association between preconception BMI and child BMI such as metabolic programming via epigenetic mechanisms. Further study is required to investigate other potential mechanisms.

Maternal preconception obesity may be associated with breastfeeding duration through barriers in infant latching [46], disruption in lactogenesis II [47], and lower milk production in mothers with obesity [48]. Maternal obesity is also associated with increased risk for postpartum depression and lower levels of breastfeeding self-efficacy, both known risk factors for decreased breastfeeding duration [49, 50]. Unfortunately, those living with overweight and obesity have been found to experience weight stigma from lactation experts, which in turn decreases the mothers' desire to seek help in navigating these breastfeeding barriers [51].

Breastfeeding is thought to help children develop eating behaviours that are protective against obesity through the development of satiety cue regulation [52]. Variations in the hormones and human milk components found in breast milk can also vary across mothers by BMI, specifically leptin and insulin, which can influence child hunger, satiety and growth patterns [53]. Rogers et al. found a longer breastfeeding duration was associated with children eating slower, a behaviour thought to be protective against obesity in later life [12]. Yelverton et al., found in their cross-sectional cohort study that longer total breastfeeding duration was associated with lower food responsiveness (general appetite for food or desire to eat) at 5 years of age, another obesogenic protective behaviour [54]. Longer breastfeeding duration was also found to be associated with maternal feeding behaviours where mothers were less likely to restrict children's food intake at 1 year of age, which can help promote better child self-regulation around food [55].

Many studies have investigated breastfeeding duration, both exclusive and total duration, and their associations with child dietary intake. Perrine et al. found that longer exclusive and total breastfeeding durations to be associated with overall higher odds of consuming daily intakes of fruits, vegetables and lower odds of sugar-sweetened beverages and juice at 6 years of age [14]. Burnier et al., found that children who were exclusively breastfed for longer than 3 months had higher odds of consuming more daily servings of vegetables at 4 years of age [10]. Soldateli et al., found breastfeeding duration in adolescent mothers for 12 months or longer, but not exclusive breastfeeding, was associated with increased weekly vegetable consumption in children at 4–7 year of age [15]. Our research team found that breastfeeding durations of >6–12 months was associated with a lower child nutritional risk and decreased sugary and sweet snack consumption at 3–5 years of age [13].

We found insufficient evidence to conclude a mediating effect of breastfeeding in those who reported earning an annual

Table 4. Mediation of breastfeeding duration analysis results on total NutriSTEP® score stratified by income.

	Total NutriSTEP® score all ages \$0 to \$79,999 (n = 892)		Total NutriSTEP® score all ages ≥ \$80,000 (n = 3176)	
	Pooled Mean (95% CI)	P-value	Pooled Mean (95% CI)	P-value
Total effect	0.032 (−0.033, 0.096)	0.336	0.124 (0.090, 0.159)	<0.001
Natural direct effect	0.025 (−0.039, 0.089)	0.441	0.112 (0.078, 0.146)	<0.001
Natural indirect effect	0.007 (−0.004, 0.017)	0.217	0.012 (0.06, 0.018)	<0.001
Proportion Mediated	16.71% (−31.95, 92.77)		10.11% (4.17, 14.70)	

household income below \$80,000. There is evidence that in high-income countries, women living with lower income have increased obesity rates [5], and shorter breastfeeding durations [56]. While research has found that maternal preconception BMI is associated with nutritional risk outcomes in early childhood [22], it is unknown if this association is stronger in higher-income families. There are conflicting results in toddlers with lower household income, where toddlers with lower household income was associated with poorer diet quality compared to those with higher incomes [22]. Another study, found no evidence of an association between household income and vegetable intake in children at 4 years of age [10].

One possible reason for why we were unable to find evidence of a mediation effect in lower-income families may be a ceiling effect. NutriSTEP® scores were on average higher in the low-income group, with larger proportion in the moderate to high-risk category (Supplementary Table 8). It is possible that the NutriSTEP® is more sensitive to changes lower in its score range. If that is the case, we would expect factors associated with the total NutriSTEP® (such as breastfeeding and/or maternal preconception BMI) to have stronger associations in the lower range of the NutriSTEP®; therefore, populations that tend to have lower NutriSTEP® scores, such as the higher income group in this study, may see stronger associations with the NutriSTEP® score. This may explain why the total effect in the higher income group was much higher than in the lower income group, and the estimated proportion mediated was higher in the lower income group. We also found that compared to those with higher income, those with lower income had less variation in breastfeeding duration by BMI, suggesting that the relationship between BMI and breastfeeding duration is not as strong in lower income population in our study (Supplementary Fig. 3). It is also possible that our study may not have been sufficiently powered to detect a mediation effect in this lower income group ($n=892$ lower income, $n=3176$ higher income). Future work should investigate these relationships in lower income populations.

Strengths of this study include a large sample size of mothers and children, with data on breastfeeding and child nutritional risk. The study analysis also included adjustment for covariates shown in previous literature to potentially confound these relationships. The mediator, total breastfeeding duration, had very little missingness (<1%). The study outcome, measured by NutriSTEP® provided an overall assessment of potential nutritional factors that may contribute to a child's overall nutritional status, rather than a singular measure of dietary intake often reported in other similar studies.

The study had a lower proportion earning below an annual household income of \$80,000, which may have limited power to detect mediation differences in this group. Maternal diet, gestational weight gain, and maternal health factors during preconception could be a source of unmeasured confounding, and prospective data collection for these factors are ongoing. Education attainment is a factor associated with obesity and poor breastfeeding outcomes [57, 58], where our sample had low variation in maternal education, therefore we were unable to adjust for this potential effect in the analysis. This study utilised

more self-reported preconception BMIs than measured values, where it has been shown that self-reported preconception weight is often subject to under report, it has also been shown that self-reported BMI from pre-pregnancy are reportedly accurate, and misclassification and magnitudes of error are often small [59]. We did not obtain information on whether the lactating person identified as female, and therefore acknowledge the term breastfeeding may not be inclusive for all. Mean (SD) duration of breastfeeding was not clinically different between those with obesity and overweight (12.6 (7.7)) and those with underweight and normal weight (12.0 (8.80)). Lastly, this study did not examine breastfeeding exclusivity. However, research has indicated that both exclusive and total duration breastfeeding measures are highly correlated, where exclusive breastfeeding for 4–17 weeks was found to be associated with total breastfeeding duration at 15 different timepoints in the first year of life [60].

This study found that total breastfeeding duration mediated ~13% of the association between higher maternal preconception BMI with a higher nutritional risk in children ages 18 months to 5 years. Dietary intake preferences and eating behaviours are developed early and track into adulthood. This study supports that higher maternal preconception BMI may negatively impact total breastfeeding duration, which may contribute to nutritional risk in childhood. This study was unable to conclude a mediation effect in the lower income group, and future studies are needed to determine which factors that are unique to low-income families. Future research could include the role of paternal BMI, along with other paternal health and lifestyle factors during preconception and how it may relate to outcomes in child nutritional health. These findings highlight that the preconception period may be an important time in life to develop and test preventative interventions to optimise maternal health for improving breastfeeding duration and children's nutritional health.

DATA AVAILABILITY

Data described in the manuscript, code book, and analytic code will be made available upon request pending application and approval.

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KEB, CDGK-S, CSB, DLOC, JLM: Designed research (project conception, development of overall research plan, and study oversight); KEB: Conducted research; CKS, JRS: Provided essential materials (research database, questionnaires); KEB, CDGK-S, XL: Performed statistical analyses; KEB: Wrote paper; KEB, CSB: Had primary responsibility for final content; CLD, JAO, JRS, XL, CDGK-S, CSB, DLOC, JLM: provided expertise review and feedback on manuscript content; All authors read and approved manuscript.

COMPETING INTERESTS

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ADDITIONAL INFORMATION

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