



# Allergic sensitization trajectories to age 8 years in the Singapore GUSTO cohort

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## ABSTRACT

**Background:** Allergic sensitization is linked to allergy development, with early sensitization often associated with worse outcomes. We aimed to identify if distinct allergic sensitization trajectories existed within a diverse and multi-ethnic Asian cohort.

**Methods:** We administered modified ISAAC questionnaires in the first 8 years and conducted skin prick testing at ages 18 months, 3, 5 and 8 years in the Growing Up in Singapore Towards healthy Outcomes (GUSTO) cohort. We used latent class analysis to derive allergic sensitization trajectories, and adjusted odds ratios (AOR) to evaluate predictive risk factors and associations with allergic comorbidities.

**Results:** Among 997 children, three trajectories were identified: early food and mite sensitization (16.2%), late mite sensitization (24.2%) and no/low sensitization (59.6%). Early food and mite sensitization was associated with early eczema by 6 months [AOR (95%CI) 4.67 (1.78-12.28)], increased risk of wheeze by 3-8 years (ARR 1.72-1.99) and eczema in the first 8 years of life (ARR 1.87-2.41). Late mite sensitization was associated with female sex [AOR 0.58 (0.35-0.96)], cesarean section [AOR 0.54 (0.30-0.98)], early eczema by 6 months [AOR 3.40 (1.38-8.42)], and increased risk of eczema by 18 months [ARR 1.47 (1.03-2.08)] and 8 years [ARR 1.35 (1.05-1.73)].

**Conclusion:** Early onset of eczema and early allergic sensitization were strongly associated. Early sensitization, especially to house dust mites, was associated with increased risks of developing wheeze and eczema, pointing to the importance of developing preventive perinatal interventions and effective therapeutics for sensitized toddlers.

**Keywords:** Allergic sensitization trajectories, Latent class analysis, Eczema, Wheeze, House dust mite

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## INTRODUCTION

Globally, the prevalence of allergic diseases in children is approximately 30–35%.<sup>1</sup> Allergic sensitization is associated with a prominent T-helper 2 (Th2) immune response,<sup>2,3</sup> which drives the development of allergic diseases.<sup>4,5</sup> Evidence of association between early allergic sensitization and allergic outcomes has been presented by a number of studies.<sup>4</sup> The Isle of Wight birth cohort showed that allergic sensitization was associated with higher risks of asthma, rhinitis and eczema development at age 4 years.<sup>6</sup> In Chinese schoolchildren from Hong Kong, Malaysia and China, indoor allergic sensitization was associated with higher risks of asthma and rhinitis development.<sup>7</sup> However, these studies did not examine the longitudinal patterns of allergic sensitization trajectories.

The use of latent class analysis (LCA), an unsupervised data driven statistical method, allows identification of allergic sensitization trajectories which are not predefined and not directly discernible from complex data.<sup>8</sup> We define the term “trajectories” as longitudinal changes in sensitization to different number and types of allergens from infancy to early childhood. This method utilises maximum likelihood estimation to produce homogenous subgroups from a diverse population.<sup>9</sup> Allergic sensitization trajectories can identify the number and type of allergic sensitization over different time periods and further elucidate the relationships between atopy and allergic diseases.

Increasing evidence has highlighted the importance of allergic sensitization trajectories in predicting allergy development. The WHEALS birth cohort derived four trajectories of allergic sensitization using LCA and found that only children belonging to “highly-sensitized” trajectory had increased risk of asthma by four years old.<sup>10</sup> Similarly, the MAAS cohort used a nested two-stage LCA and found that children with mite sensitization to seven components of mite allergens had the highest risk of developing asthma with comorbid rhinitis and eczema.<sup>11</sup> However, current studies that have evaluated allergic sensitization trajectories are mainly from European countries where allergen exposure and sensitization profiles differ from the tropical

climate in Singapore. For example, more than 80% of Singaporean Chinese adults (the ethnicity of highest proportion in Singapore) had dust mite sensitization<sup>12</sup> as compared to 10% in a Swedish adult population<sup>13</sup> due to the perennial hot and humid weather in Singapore.<sup>14</sup> Asian countries also tend to have higher shellfish and lower peanut and pollen sensitization rates.<sup>14,15</sup>

We hypothesized that there is an underlying heterogeneity in the trajectories of allergic sensitization development, which are in turn associated with different allergic diseases and predictors. In this study, we examined whether distinct allergic sensitization trajectories existed within our ethnically diverse population-based cohort using the results from repeated skin prick testing (SPT) over 8 years in the Growing Up in Singapore Towards healthy Outcomes (GUSTO) cohort. We also determined if the trajectories were associated with different predictors and differential risk for the clinical outcomes of eczema, wheeze with use of nebulizer and rhinitis.

## METHODS

### Study design and definition of allergic outcomes

The GUSTO study is a prospective population-based cohort study involving 1247 healthy pregnant mothers and their offspring. Healthy pregnant women aged 18 and above who were attending their first-trimester antenatal dating ultrasound scan clinics at two major public maternity units in Singapore, National University Hospital and KK Women’s and Children’s Hospital from June 2009 to September 2010, were invited to participate. They had to be Singaporeans or permanent residents, belong to any of the major ethnic groups (Chinese, Malay or Indian) in Singapore, and intend to give birth at either hospital, donate their birth tissues and reside in Singapore for at least five years. Detailed methodology was described by Soh et al.<sup>16</sup> The modified International Study of Asthma and Allergies in Childhood (ISAAC) questionnaire was used to evaluate offspring allergic symptoms at ages 3, 6, 9, 12, 15, 18 months and 2, 3, 4, 5, 6, 7 and 8 years. Questions used are listed in Supplementary Text 1. The conduct of this study was based on the guidelines in the Declaration of Helsinki. Informed written consent was obtained from all participants.

## Allergic sensitization

SPT was conducted at ages 18 months, 3, 5 and 8 years to major relevant allergens in Singapore, which included cow's milk, egg, peanut and house dust mites, *Dermatophagoides pteronyssinus*, *Dermatophagoides farina* (Greer Laboratories, Lenoir, NC, USA) and *Blomia tropicalis*. SPT was defined as positive at a timepoint if any of the allergens tested positive at the timepoint with an average wheal size of at least 3 mm.

## Statistical methods

The study aimed to find out subgroups of children with distinct allergic sensitization profiles over 8 years of follow-up based on SPT to the major relevant allergens. An exploratory, unsupervised LCA was performed by using the doLCA program in the LCA Stata plugin<sup>17</sup> to derive the allergic sensitization trajectories based on SPT at ages 18 months, 3, 5, and 8 years.<sup>18</sup> LCA was employed because it is often used to identify subgroups of people based on their individual characteristics.<sup>19</sup> Both latent variable (ie, children subgroups) and observed variables (ie, allergic sensitization) are categorical in this context. LCA assumes local independence, which means that observed variables are independent conditional on a particular latent class. Participants who had completed at least one SPT were included into the analysis. We fitted models from one through six classes. Each model was repeatedly estimated 100 times with a prespecified seed, to find the optimal seed or starting values of parameters that maximized the likelihood function. This step also helped to check model identification and avoid suboptimal local maxima. The final number of latent classes were chosen based on the Akaike information criterion and Bayesian information criterion, as well as the identification and interpretability of the model. Posterior probabilities of class membership were generated for each child. The child was subsequently assigned to the class with the highest posterior probability. Variables were summarized by frequency (percentage) and mean (standard deviation) as appropriate. Chi-square, Fisher's exact, independent two-sample *t* and Wilcoxon rank-sum tests were used to compare demographic variables. Associations between predictors and allergic sensitization

trajectories were evaluated by multivariable multinomial logistic regression. Associations between allergic sensitization trajectories and allergic diseases were assessed by multivariable Poisson regression with robust error variance, adjusted for confounders. The Benjamini-Hochberg procedure with a prespecified false discovery rate was applied to reduce type I errors associated with multiple comparisons. All statistical analyses were conducted in Stata/SE 16.1 for Windows (Stata-Corp LLC, College Station, TX USA) assuming two-sided tests with a 5% significance level.

## RESULTS

The study population comprised 997 mother-child dyads after excluding subjects without data on SPT. The majority of the mothers were of Chinese ethnicity [565 (56.7%)] and had post-secondary and higher education [692 (70.3%)]; 52.5% of participants were boys (Table 1). There were no differences in demographic characteristics such as child's sex and ethnicity between included and excluded participants while mean maternal age was higher for included participants (Supplementary Table 1).

### Identification of allergic sensitization trajectories

LCA classified the children into three allergic sensitization trajectories (Fig. 1 and Supplementary Figure 1). Conditional probability is the probability of an allergic sensitization at a time point conditional on a particular trajectory. Depending on the time of onset, we labelled these as early food and mite sensitization (EFMS) (16.2%), late mite sensitization (LMS) (24.2%), and no/low sensitization (59.6%, reference).

### Early food and mite sensitization (EFMS)

Compared to children from the no/low sensitization trajectory, those in the EFMS trajectory were more likely to be boys, have a family history of allergy, mixed breastfeeding and formula feeding, eczema in early life by 6 months and to have attended childcare during infancy (Table 1). They were also less likely to be of Indian ethnicity and to have owned a dog during infancy (Table 1). Multivariable analysis adjusting for confounders showed that children with EFMS had higher odds of having early eczema by 6 months (Table 2).

	Total (n = 997)	No/low sensitization (n = 594)	Early food and mite sensitization (n = 162)	P	Late mite sensitization (n = 241)	P
<b>Demographics, n (%)</b>						
Sex				0.008 <sup>a</sup>		0.042 <sup>a</sup>
Male	523 (52.5)	289 (48.7)	98 (60.5)		136 (56.4)	
Female	474 (47.5)	305 (51.4)	64 (39.5)		105 (43.6)	
Ethnicity				0.002 <sup>a</sup>		0.001 <sup>a</sup>
Chinese	565 (56.7)	317 (53.4)	100 (61.7)		148 (61.7)	
Malay	248 (24.9)	139 (23.4)	45 (27.8)		64 (26.7)	
Indian	183 (18.4)	138 (23.2)	17 (10.5)		28 (11.7)	
Maternal education level				0.244		0.119
Secondary school education or less	293 (29.7)	187 (31.9)	43 (27.0)		63 (26.4)	
Post-secondary and higher	692 (70.3)	400 (68.1)	116 (73.0)		176 (73.6)	
Family history of allergy	482 (54.1)	265 (49.9)	84 (59.2)	0.050 <sup>a</sup>	133 (61.0)	0.006 <sup>a</sup>
Maternal plasma Vitamin D3				0.476		0.264
Deficient	117 (13.7)	74 (14.6)	19 (13.8)		24 (11.6)	
Insufficient	230 (27.0)	145 (28.6)	33 (23.9)		52 (25.1)	
Sufficient	505 (59.3)	288 (56.8)	86 (62.3)		131 (63.3)	
Maternal age in years <sup>b</sup>	31 (5)	31 (5)	32 (5)	0.334	32 (5)	0.119
Parity				0.920		0.671
0	448 (44.9)	270 (45.5)	76 (46.9)		102 (42.3)	
1	334 (33.5)	195 (32.8)	53 (32.7)		86 (35.7)	
≥2	215 (21.6)	129 (21.7)	33 (20.4)		53 (22.0)	
Gestational age in weeks <sup>b</sup>	38.8 (1.5)	38.8 (1.5)	38.8 (1.6)	0.742	38.8 (1.3)	0.450
<b>Environmental factors, n (%)</b>						
Tobacco exposure during pregnancy	355 (37.5)	205 (36.6)	57 (36.8)	0.970	93 (39.9)	0.381

(continued)

	Total (n = 997)	No/low sensitization (n = 594)	Early food and mite sensitization (n = 162)	P	Late mite sensitization (n = 241)	P
Mode of delivery				0.213		0.505
Vaginal delivery	693 (69.6)	405 (68.2)	118 (73.3)		170 (70.5)	
Cesarean section	303 (30.4)	189 (31.8)	43 (26.7)		71 (29.5)	
Breastfeeding				0.001 <sup>a</sup>		0.095
Mainly breastfeeding	116 (12.3)	72 (12.8)	13 (8.8)		31 (13.3)	
Mixed feeding	425 (44.9)	227 (40.3)	86 (58.1)		112 (47.9)	
Mainly formula feeding	405 (42.8)	265 (47.0)	49 (33.1)		91 (38.9)	
Eczema in early life by 6 months	76 (8.8)	29 (5.7)	27 (19.6)	<0.001 <sup>a</sup>	20 (9.2)	0.082
Cat ownership by 1 year	31 (3.9)	19 (4.2)	5 (3.9)	0.874	7 (3.5)	0.682
Dog ownership by 1 year	59 (7.5)	40 (8.8)	2 (1.5)	0.003 <sup>a</sup>	17 (8.5)	0.889
Childcare attendance by 1 year	70 (12.8)	30 (9.7)	19 (20.7)	0.005 <sup>a</sup>	21 (14.6)	0.123

**Table 1. (Continued)** Characteristics of participants according to allergic sensitization trajectory. <sup>a</sup>*p* value that was significant after using the Benjamini-Hochberg procedure with a proposed false discovery rate of 5%. <sup>b</sup>Data presented as mean (SD)

In multivariable analysis, compared to children in the no/low sensitization trajectory, children with EFMS had higher odds of wheeze development by ages 3, 5, and 8 years and eczema development in the first 8 years of life (Table 3 and Supplementary Table 2). No association was observed between EFMS and rhinitis development in the first 8 years of life.

#### Late mite sensitization (LMS)

Compared to children from the no/low sensitization trajectory, those in the LMS trajectory were less likely to be girls or to be of Indian ethnicity and more likely to have a family history of allergy (Table 1). Multivariable analysis showed that female sex and cesarean section were associated with lower odds of LMS and children with LMS had higher odds having eczema in early life by 6 months (Table 2).

In multivariable analysis, compared to children in the no/low sensitization trajectory, children with LMS had higher odds of eczema by 18 months and 8 years (Table 3 and Supplementary Table 2). No association was observed between LMS and

wheeze and rhinitis development in the first 8 years of life.

## DISCUSSION

In this study, LCA of data collected over multiple timepoints in the first 8 years of life generated three trajectories of allergic sensitization, EFMS, LMS and no/low sensitization. These trajectories were associated with different clinical outcomes. EFMS was associated with wheeze development by 3–8 years and eczema development in the first 8 years. LMS was associated with eczema by 18 months and 8 years only (Fig. 2). Notably, there was low food allergen sensitization and high house dust mite sensitization in this cohort study conducted in Singapore with a year-round tropical climate.

We found EFMS to be associated with higher odds of wheeze and eczema development, highlighting the association between early allergic sensitization and the development of wheeze and eczema. Our findings are supported by other cohorts; the CAPS cohort in Australia observed that early mixed food and inhalant trajectory was

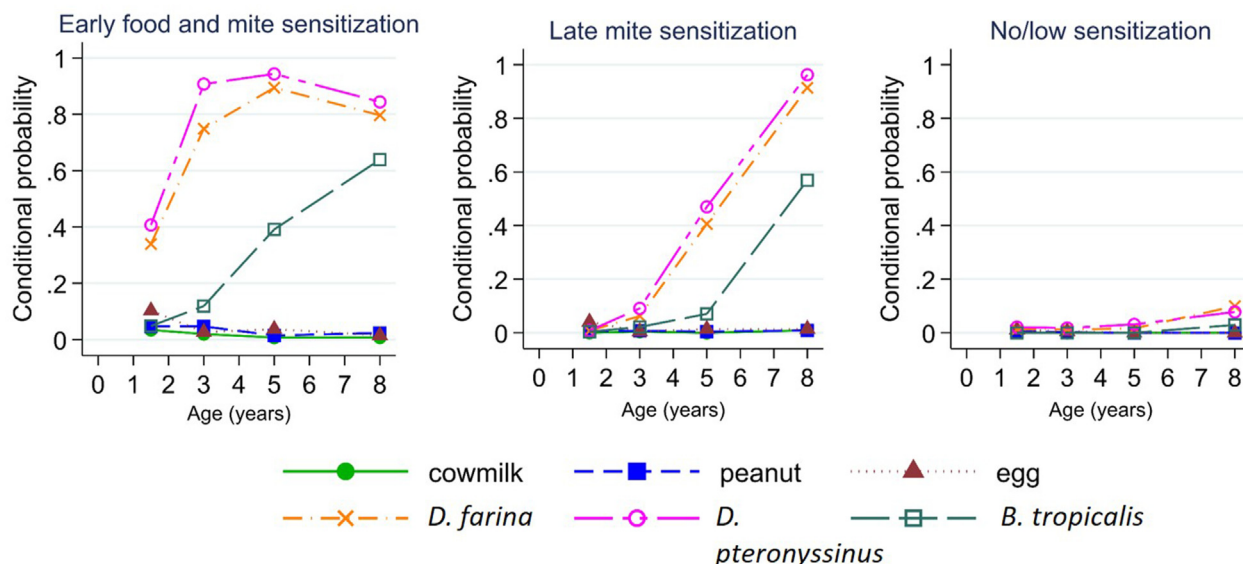


Fig. 1 Probability of allergic sensitization conditional on latent class membership

associated with the highest odds of development of eczema and asthma at 8 years as compared to other trajectories.<sup>20</sup> The PARIS birth cohort in France used k-means clustering and found that early and persistent sensitization was associated with highest odds of isolated atopic dermatitis development in childhood.<sup>21</sup> The MAS cohort in Germany and the PASTURE cohort on five European countries used LCA and found that the severe atopy trajectory featuring early food and mite sensitization was also associated with highest odds of lifetime eczema and asthma development by six years.<sup>22</sup> Early sensitization may signify the onset of the atopic march leading to subsequent development of other allergic diseases. To reduce the risk of development of allergic diseases, it is likely to be beneficial to prevent allergic sensitization in early life.

Conversely, LMS was only associated with higher risk of eczema by 18 months and 8 years and was not associated with wheeze and rhinitis in the first 8 years of life. Longer follow up is needed to evaluate the influence of LMS on subsequent development of allergic outcomes. Besides this, none of the sensitization trajectories was associated with rhinitis in our study, contrary to findings in other studies.<sup>20,23</sup> A possible reason could be that we did not differentiate between transient and persistent as well as allergic and non-allergic or infectious rhinitis.

Early onset eczema by six months was associated with both EFMS and LMS. Our result is supported by the Melbourne Atopy Cohort Study which also reported that early eczema by six months preceded and predicted allergic sensitization at one year.<sup>24</sup> Recently, the “outside-in” hypothesis, which postulates that early onset of eczema increases susceptibility to transcutaneous sensitization by allergens and initiates the atopic march leading to asthma and rhinitis, has gained attention.<sup>25</sup> Eczema with filaggrin mutations, a key gene in the skin barrier, has been associated with skin barrier integrity and degree of inhalant allergic sensitization, while such associations were not found for children with eczema who did not have filaggrin mutations.<sup>26</sup> Allergic sensitization can in turn increase the risk of having subsequent eczema later in childhood.<sup>4</sup> The Danish Allergy Research Centre cohort showed that, similar to our study, development of subsequent atopic dermatitis at age six years was associated with early food and inhalant sensitization and early atopic dermatitis from 0 to 18 months.<sup>27</sup>

Besides early onset of eczema, female sex was also associated with lower odds of LMS. Sex-related differences in atopy development in childhood is well-documented, where prepubertal boys tend to have higher rates of sensitization likely due to higher expression of Th2 cytokines, interleukin-5 and interleukin-13.<sup>28</sup>

	Early food and mite sensitization AOR (95% CI)	P	Late mite sensitization AOR (95% CI)	P
Sex				
Male	Ref	-	Ref	-
Female	0.72 (0.40-1.32)	0.294	0.58 (0.35-0.96)	0.033 <sup>a</sup>
Ethnicity		0.532		0.121
Chinese	Ref	-	Ref	-
Malay	1.02 (0.41-2.49)	0.971	1.26 (0.63-2.52)	0.521
Indian	0.54 (0.18-1.63)	0.273	0.45 (0.18-1.09)	0.078
Maternal education level				
Secondary school education or less	Ref	-	Ref	-
Post-secondary and higher	1.22 (0.53-2.78)	0.642	1.61 (0.85-3.03)	0.142
Family history of allergy	1.27 (0.68-2.37)	0.458	1.08 (0.65-1.80)	0.775
Maternal plasma Vitamin D3		0.730		0.530
Deficient	Ref	-	Ref	-
Insufficient	0.93 (0.30-2.89)	0.905	0.82 (0.34-1.99)	0.658
Sufficient	1.24 (0.42-3.62)	0.697	1.16 (0.50-2.66)	0.735
Maternal age in years	1.03 (0.96-1.10)	0.453	0.97 (0.92-1.03)	0.365
Parity		0.981		0.444
0	Ref	-	Ref	-
1	0.97 (0.47-1.97)	0.924	1.35 (0.74-2.46)	0.326
≥2	0.91 (0.35-2.36)	0.844	1.55 (0.74-3.25)	0.240
Gestational age in weeks	1.01 (0.81-1.27)	0.915	1.09 (0.89-1.33)	0.401
Tobacco exposure during pregnancy	0.85 (0.39-1.85)	0.688	1.23 (0.68-2.22)	0.490
Mode of delivery				
Vaginal delivery	Ref	-	Ref	-
Cesarean section	0.72 (0.37-1.42)	0.348	0.54 (0.30-0.98)	0.042 <sup>a</sup>
Breastfeeding		0.026		0.360
Mainly breastfeeding	Ref	-	Ref	-
Mixed feeding	2.43 (0.96-6.16)	0.061	1.47 (0.71-3.04)	0.305
Mainly formula feeding	1.03 (0.36-2.98)	0.952	1.01 (0.46-2.21)	0.988
Eczema in early life by 6 months	4.67 (1.78-12.28)	0.002 <sup>a</sup>	3.40 (1.38-8.42)	0.008 <sup>a</sup>
Cat ownership by 1 year	1.51 (0.43-5.35)	0.525	0.85 (0.27-2.61)	0.771
Dog ownership by 1 year	0.13 (0.02-1.08)	0.059	0.97 (0.39-2.41)	0.945
Childcare attendance by 1 year	2.12 (0.92-4.90)	0.078	2.01 (0.97-4.15)	0.059

**Table 2.** Association between characteristics of participants and allergic sensitization trajectory by multivariate multinomial logistic regression (n = 396). AOR, adjusted odds ratio; CI, confidence interval. No/low sensitization trajectory was the baseline group for odds. <sup>a</sup>p value that was significant

In this study, we used LCA to derive allergic sensitization trajectories. LCA has been widely used in social and behavioural sciences and both open-source and commercial software are available for the implementation of the methods.<sup>19</sup> The

full information maximum likelihood approach is adopted in most software to maximize the usage of data and reduce the impact of missing data. However, in situations where subjects are to be assigned to different latent classes for

	Early food and mite sensitization		Late mite sensitization	
	ARR (95% CI)	P	ARR (95% CI)	P
Wheezing by 18 months	1.32 (0.80-2.18)	0.271	1.14 (0.72-1.79)	0.580
Wheezing by 3 years	1.72 (1.26-2.35)	0.001 <sup>a</sup>	1.20 (0.86-1.68)	0.285
Wheezing by 5 years	1.81 (1.41-2.33)	<0.001 <sup>a</sup>	1.21 (0.91-1.60)	0.181
Wheezing by 8 years	1.99 (1.56-2.53)	<0.001 <sup>a</sup>	1.31 (1.00-1.71)	0.050
Eczema by 18 months	2.41 (1.74-3.34)	<0.001 <sup>a</sup>	1.47 (1.03-2.08)	0.033 <sup>a</sup>
Eczema by 3 years	2.08 (1.57-2.74)	<0.001 <sup>a</sup>	1.34 (0.99-1.82)	0.058
Eczema by 5 years	1.90 (1.46-2.46)	<0.001 <sup>a</sup>	1.31 (0.99-1.73)	0.058
Eczema by 8 years	1.87 (1.47-2.37)	<0.001 <sup>a</sup>	1.35 (1.05-1.73)	0.019 <sup>a</sup>
Rhinitis by 18 months	0.97 (0.81-1.17)	0.788	0.89 (0.74-1.06)	0.192
Rhinitis by 3 years	1.00 (0.86-1.16)	0.974	0.96 (0.83-1.11)	0.545
Rhinitis by 5 years	0.98 (0.84-1.13)	0.743	0.95 (0.84-1.09)	0.498
Rhinitis by 8 years	0.99 (0.86-1.15)	0.906	0.93 (0.82-1.06)	0.290

**Table 3.** Association between allergic sensitization trajectory and allergic comorbidity by multivariate Poisson regression with robust error variance. ARR, adjusted relative risk; CI, confidence interval. No/low sensitization trajectory was the reference group for relative risk. Sex, ethnicity, maternal education level and family history of allergy were adjusted in the multivariate Poisson regression with robust error variance for each allergic comorbidity. <sup>a</sup>p value that was significant

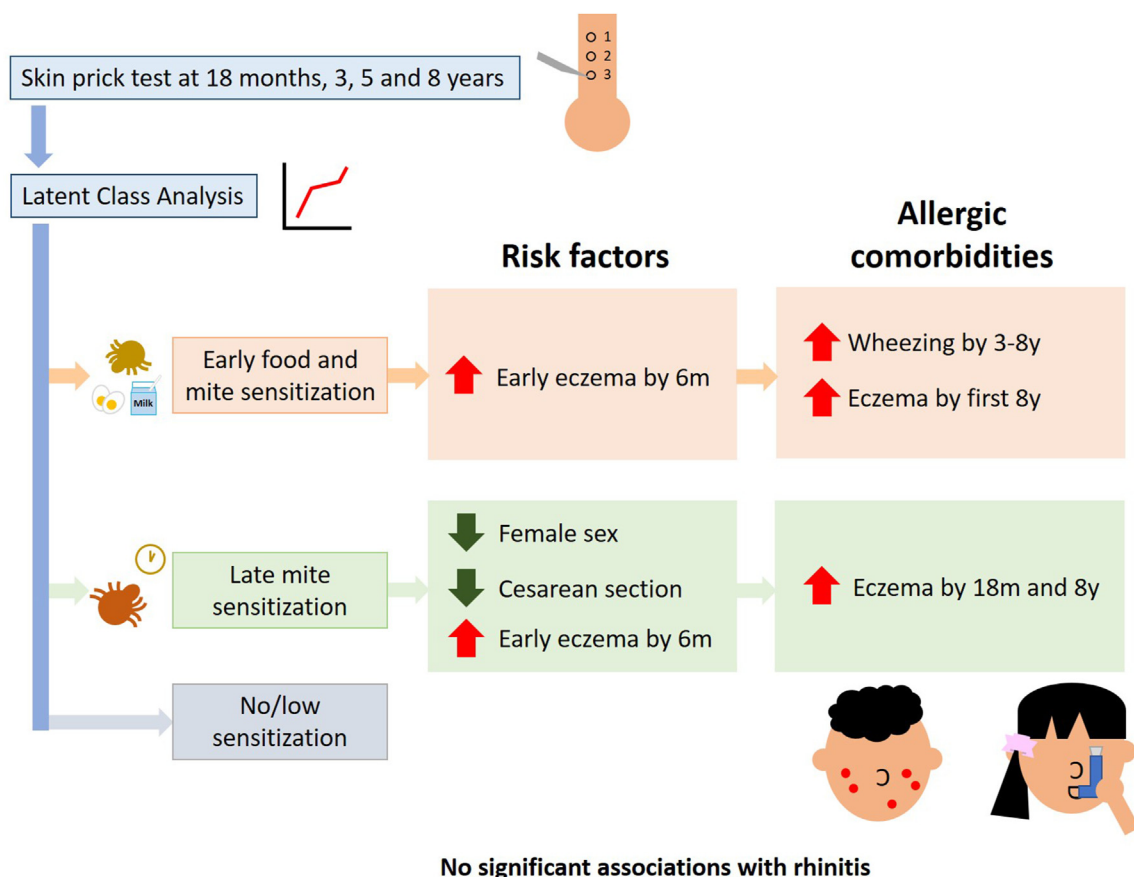
subsequent analysis, there may be classification uncertainty in some individuals. Moreover, when applied to longitudinal data over multiple follow-up times, LCA directly computes item-response probabilities without assuming any time trend. This may result in large number of parameters to be estimated as well as discontinuous patterns over time.

Strengths of this study include multiple SPT performed at regular intervals, which allowed us to observe the changes in allergic sensitization over time as compared to other studies with fewer timepoints of data collection.<sup>21</sup> The extensive data collection also allowed us to study predictors of these trajectories. A limitation of this study is parental report of doctor-diagnosed allergic outcomes. However, the very regular follow up of the participants at multiple timepoints with structured interviewer-administered questionnaires would have minimised recall bias and increased the likelihood of capturing information on a child's visit to the doctor for allergy-related issues. We also tested for a limited panel of six allergens in SPT. However, we focused on major relevant allergens

in Singapore;<sup>29</sup> hence, we were likely to have captured the most important sensitization profiles in Singaporean children. Cat and dog dander were not studied due to low ownership and sensitization rates.<sup>29</sup> In addition, the results from this study may not be generalizable to Singapore's population as women of Malay and Indian ethnicities were overrepresented on purpose at recruitment.<sup>16</sup>

In conclusion, this study identified three distinct allergic sensitization trajectories as well as differential predictors and risks associated with clinical outcomes in a longitudinal study of Singapore children from birth to eight years using LCA. Our results showed that early sensitization, especially to house dust mites, was associated with a higher risk of developing wheeze and eczema, pointing to the importance of implementing preventive perinatal interventions and effective therapeutics for sensitized toddlers. As early development of eczema by six months was a common risk factor for both allergic sensitization trajectories, it is hence important to prevent and seek medical attention for early onset eczema.





**Fig. 2** Three allergic sensitization trajectories using latent class analysis were identified. The trajectories identified were early food and mite sensitization (EFMS), late mite sensitization (LMS) and no/low sensitization. Early onset of eczema were associated with higher odds of development of EFMS and LMS. Female sex and cesarean section were also associated with lower odds of LMS. EFMS was associated with wheeze development by 3–8 years and eczema development in the first 8 years. LMS was associated with eczema by 18 months and 8 years only. None of the trajectories were associated with rhinitis

### Abbreviations

AOR: Adjusted odds ratio; ARR: Adjusted relative risk; EFMS: Early food and mite sensitization; GUSTO: Growing Up in Singapore Towards healthy Outcomes; ISAAC: International Study of Asthma and Allergies in Childhood; LCA: Latent class analysis; LMS: Late mite sensitization; SPT: Skin prick testing; Th2: T-helper 2

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### Availability of data and materials

The data that support the findings of this study are available on request from the corresponding author. The data is not publicly available due to privacy or ethical restrictions.

### Authors' contribution

Lau HX and Chen ZJ analysed the data and wrote the manuscript. Chan YH provided statistical advice. Tham EH, Goh AEN, Van Bever HP, Teoh OH, Karnani N, Gluckman PD, Tan KH, Yap FKP, Godfrey KM, Eriksson JG, Chong YS, Lee BW and Shek LPC contributed to the study design and provided intellectual input. Loo EXL conceptualized the study design, contributed to the analysis and wrote the

manuscript. All authors critically reviewed and approved the manuscript as submitted and agreed to be accountable for all aspects of the work.

### Ethics, consent and permissions

Ethics approval was obtained from the Domain Specific Review Board of Singapore National Healthcare Group (D/2009/021) and the Centralised Institutional Review Board of SingHealth (2018/2767). The conduct of this study was based on the guidelines in the Declaration of Helsinki. Informed written consent was obtained from all participants.

### Agreement to publish the work

All authors have read through and approved the publication of the manuscript.

### Editorial policy confirmation and agreement

All authors confirm and agree to the editorial policy.

### Confirmation of unpublished work

All authors confirm that the manuscript is original, has not been published before, is not currently being considered for publication elsewhere, and has not been posted to a preprint server.

### Declaration of competing interest

Godfrey KM has received reimbursement for speaking at conferences sponsored by Nestle. Godfrey KM and Chong YS are part of an academic consortium that has received research funding from Abbot Nutrition, Nestle and Danone. All other authors declare no conflict of interest.

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### Appendix A. Supplementary data

Supplementary data to this article can be found online at <https://doi.org/10.1016/j.waojou.2022.100667>.

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