# **RESEARCH ARTICLE**





Random capillary glucose levels throughout pregnancy, obstetric and neonatal outcomes, and long-term neurodevelopmental conditions in children: a group-based trajectory analysis

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# Abstract

Background Gestational diabetes mellitus (GDM) is associated with both short- and long-term risks, although it is unknown if risks vary by severity, timing, and duration of gestational hyperglycemia. We aimed to identify trajectories of random capillary glucose (RCG) levels throughout pregnancy and assess their associations with both obstetric/ neonatal outcomes and children's risk of neurodevelopmental conditions (NDCs) (i.e., autism, intellectual disability, and attention-deficit/hyperactivity disorders [ADHD]).

Methods A population-based cohort study was conducted involving 76,228 children born to 68,768 mothers without pregestational diabetes. Group-based trajectory modeling was utilized to identify distinct glucose trajectories across RCG values throughout the course of pregnancy. The associations between these trajectory groups and obstetric/neonatal outcomes as well as children's NDCs were then assessed using generalized estimating equation models with a logit link. The Benjamini-Hochberg (BH) procedure was employed to adjust P-values for multiple comparisons, controlling the false discovery rate (FDR).

**Results** Five distinct glucose trajectory groups were identified, each with varying percentages diagnosed with GDM. Their associations with obstetric/neonatal outcomes as well as children's NDCs varied. For example, when compared to the "Persistently Low" group, other groups exhibited varying degrees of increased risk for large-for-gestational-age babies, with the exception of the "High in Early Pregnancy" group. Compared to the "Persistently Low" group, all other trajectory groups were associated with NDC outcomes, except the "High in Mid-Pregnancy" group. However, none of the associations with offspring NDCs remained significant after accounting for the FDR correction.

**Conclusions** Persistent high glucose levels or moderately elevated glucose levels throughout pregnancy, as well as transient states of hyperglycemia in early or mid-pregnancy, were found to be associated with increased risks of specific obstetric and neonatal complications, and potentially offspring NDCs. These risks varied depending on the severity, timing, duration, and management of hyperglycemia. The findings underscore the need

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**Keywords** Maternal glucose levels, Obstetric outcomes, Neonatal outcomes, Autism, Intellectual disability, Attentiondeficit/hyperactivity disorder

# Background

Hyperglycemia in pregnancy is associated with maternal overweight or obesity, which may complicate pregnancies, fetal health, and births [1, 2]. Hyperglycemia meeting the diagnostic criteria for gestational diabetes mellitus (GDM) has been associated with obstetric/ neonatal complications such as pre-eclampsia, preterm birth, abnormal birthweight, neonatal hypoxia, and neonatal hypoglycemia [3, 4], though the Hyperglycemia and Adverse Pregnancy Outcomes (HAPO) study established that even subclinical glucose levels (hyperglycemia not meeting criteria for diagnosis of GDM), measured around 28 weeks of gestation, are associated with short-term health risks [5]. Exposure to maternal GDM has been linked with increased likelihood of neurodevelopmental conditions (NDCs) in children including autism [6-11], intellectual disability (ID) [6, 9, 12], and attention-deficit/ hyperactivity disorders (ADHD) [6, 13-15]. The magnitude of these risks is likely dependent on timing of exposure to GDM [6, 7]. While it is plausible that GDM could directly influence the developing central nervous system [16], associations between GDM and NDCs may also be mediated by obstetric/neonatal complications, which are also associated with increased risks of NDCs [17-21].

Studies investigating risks associated with maternal hyperglycemia, particularly those investigating long-term outcomes like NDC diagnoses, have relied primarily on diagnoses of GDM as an exposure without information on blood glucose measurements [6-11]. Previous studies have not been able to assess if better glycemic control after the diagnosis of GDM might influence the risk of NDC outcomes [7, 13]. Furthermore, previous studies investigating the associations with offspring NDCs have not been able to control directly for confounders such as maternal psychiatric history [7, 13]. By relying on diagnoses of GDM as an exposure, it is not possible to establish whether exposure to subclinical hyperglycemia may still be harmful to children's neurodevelopment in the long term. Moreover, the criteria and screening schedule for diagnosing GDM vary across countries and regions [22], with potential discrepancies from the internationally recommended standard [5, 23]. Previous studies have shown that selective screening missed around one third of GDM cases compared to universal screening [24, 25]. The gestational week in which GDM is first detected is strongly dependent on the screening schedule used [26–28]. This may delay the identification of the true onset of GDM and potentially mask the identification of sensitive time periods during which exposure to hyperglycemia may have the greatest influence. Though effective glycemic control may prevent short-term perinatal complications [29, 30], it is unknown if a transient exposure to hyperglycemia accompanied by subsequent effective control may reduce the risk of NDCs in children compared to continuous exposure. Furthermore, it is unclear if hyperglycemic states in the low-risk population, without overt GDM diagnoses or risk factors such as overweight/obesity, are associated with perinatal complications or longterm NDCs in offspring.

In Sweden, there was no consensus on the GDM diagnostic criteria in Sweden during our study period [31]. Random capillary glucose (RCG) is routinely measured by fingertip blood at multiple antenatal visits throughout pregnancy [31]. Women with an RCG level above 8–9 mmol/l are subsequently referred for an OGTT to exclude GDM [31].

In this population-based cohort study, we first aimed to identify and characterize distinct trajectories of RCG levels throughout pregnancy using group-based trajectory modeling (GBTM). We examined the associations of maternal glucose trajectory groups with obstetric/neonatal complications and children's risks of NDCs, to understand whether these relationships varied with regard to severity, duration, and timing of maternal hyperglycemia.

## Methods

# Study population

This population-based cohort study is nested within the larger Stockholm Youth Cohort (SYC), a longitudinal record-linkage study of children resident in Stockholm 2001–2011. We linked electronic antenatal care records for births in Stockholm (from the medical journal system Obstetrix [32]) available from January 1, 2007, to December 31, 2010, to other healthcare and administrative registers, including the Medical Birth Register (MBR), for individuals within the SYC [33].

Of the 88,470 children (76,731 mothers) with births recorded 2007–2010 in Obstetrix, 636 (0.72%) children had no maternal random capillary glucose (RCG) records. Children were followed up until December 31, 2016. We excluded children who were residents in Sweden for less than 5 years or had no information on the length of residence, from multiple births, diagnosed with both an NDC and congenital malformations or inborn errors of metabolism (under the assumption that these outcomes were due to the documented genetic condition), or exposed to maternal pregestational diabetes (Additional file 1, Fig S1). For each RCG record, we excluded extreme RCG recordings outside the range of 2.8-33.3 mmol/l (which are associated with acute clinical effects [34]), those without a date recorded at sampling, or those where the difference between the index RCG record and the previous RCG record was higher/lower than 10 mmol/l (representing extreme values greater than the 0.6<sup>th</sup> centile of the RCG differences observed, suggesting potential measurement or recording error). To prepare the dataset for GBTM, we set four time intervals for sampling (see "Exposure" below and Additional file 1, Fig S2) and excluded those with RCG missing in more than one interval (n = 7047, or 8.5% of the otherwise eligible population). Ethics approval was obtained from the Stockholm regional ethical review committee (DNR 2010/1185–31/5, 2016/987–32). Informed consent was not required for the analysis of anonymized register data.

#### Exposure

The recommended monitoring schedules for antenatal clinics in Stockholm for the relevant time period suggested monitoring RCG levels at five time points over the course of pregnancy, including the first visit (i.e., 10-12, 25, 29, 33, and 37 wkGA) [35]. We aimed to capture RCG values within each of four defined time intervals:  $\leq 20$ , > 20-28, > 28-34, and > 34wkGA. The rationale was the following: (1)  $\leq$  20 wkGA captures glucose levels in early pregnancy, during which higher glucose may represent hyperglycemia first detected during pregnancy. (2) Physiologically, insulin resistance significantly increases around 24 wkGA in pregnancy, which may lead to hyperglycemia among those with insufficient insulin secretory capacity to maintain euglycemia [36]. We provided a buffer time of 4 weeks before and after this week to capture the measurements surrounding this time point which results in a category of > 20-28 wkGA. (3) We divided the third trimester at 34 wkGA which resulted in two groups, >28-34 (early third trimester), and >34 wkGA (late third trimester). Detailed information on RCG measurements during the entire pregnancy in our study was presented in Additional file 1, Table S1.

Because RCG is strongly correlated with the time interval between food intake and testing, we observed an overall pattern of RCG levels at different testing hours with a peak at 8:00 and a nadir at 12:00, and a peak at 13:00 and a nadir at 17:00 (Additional file 1, Fig S2). Therefore, we standardized the RCG levels into *z*-scores according to testing hour (Additional file 1, Fig S3), with the original RCG values in relation to the standardized *z*-scores shown in Additional file 1, Table S2. If women had RCG measured at multiple time points within an interval, we calculated the average RCG *z*-score for each gestational interval. The median frequency of measurements during each time interval was 1 (interquartile range [IQR]:1–1), 1 (1–2), 2 (1–2), and 1 (1–2), respectively, in line with the recommended monitoring schedules [35].

#### Obstetric and neonatal outcomes

Obstetric and neonatal outcomes (Additional file 1, Table S3) were ascertained from (1) the Obstetrix system: gestational week-standardized total gestational weight gain z-scores (ZGWG), according to the Swedish standard [32], rate of gestational weight gain in the second trimester (RGWG-T2), in the third trimester (RGWG-T3); (2) the National Patient Register and MBR using International Classification of Diseases-10th revision (ICD-10): gestational hypertensive diseases, long labor time, obstructed labor, neonatal birth trauma, and neonatal hypoglycemia; (3) the MBR only: preterm birth (<37wkGA), size for gestational age (i.e., small for gestational age [SGA], large for gestational age [LGA]), macrosomia (birthweight>4500 g), mode of delivery (unassisted vaginal delivery, induced vaginal delivery, assisted vaginal delivery, and cesarean section), Apgarscore <7 at 5-min; and (4) the Prescription Drug Register using Anatomical Therapeutic Chemical codes: antidiabetic treatments (i.e., glibenclamide/glyburide; metformin; insulin).

# Children's neurodevelopmental conditions

Diagnoses of autism, ID, and ADHD were ascertained in SYC from all potential pathways to care in Stockholm County [33, 37, 38] (Additional file 1, Table S3). Services for children with NDCs are provided by services run by, or contracted by, Stockholm County and are available free of charge. Developmental surveillance is performed by specially trained child healthcare center nurses at regular intervals. Diagnostic evaluations are made by professional teams, typically consisting of at least a psychologist and a medical doctor at child pediatric or mental health services. ICD-10 diagnostic codes were used to identify the diagnoses: F84 for autism, F70-F79 for ID, and F90 for ADHD. The Prescription Drug Register was used to identify additional cases of ADHD when the child was prescribed with Methylphenidate or atomoxetine [38]. Our primary outcomes were "any autism", "any ID", "any ADHD", and "any NDCs" when the child had any one of the diagnoses. As NDCs often co-occur with each other

[6, 18], we generated three mutually exclusive outcomes, namely "only autism", "only ADHD", and "autism with ADHD" (Additional file 1, Fig S4). We did not have sufficient power to examine mutually exclusive diagnoses that included ID, due to the proportionally lower number of ID diagnoses compared to autism and ADHD.

#### Covariates

The selection of potential confounders was based on previous studies that identified factors which have been associated with both exposure and outcomes, including the child's sex [39], birth year [6], maternal age [1, 6], maternal education level [6, 40], maternal BMI measured in early pregnancy [1, 6], maternal birth region [40, 41], maternal psychiatric care before the birth of the index child [6], and parity [1] (Additional file 1, Table S3). Information on the earliest timing of OGTT, receipt of anti-diabetic treatment, and the diagnosis of GDM is also presented in Table 1, though not considered in the analysis as a confounder.

# Statistical analysis

Stata 16.0 was used for data analysis. Group-based trajectory modeling (GBTM) was performed using the Stata Plugin "traj" with a censored normal modeling. Average RCG z-scores for the four defined time intervals were used to identify individuals following approximately the same pattern over time. GBTM is based on the assumption that the population is composed of distinct groups or patterns that can be identified to show a different underlying trajectory over time. It further assumes that there is no variation between individuals within the same group [42]. Maximum likelihood was used for the estimation of the model parameters. Individuals with some missing longitudinal data values are included in the analysis using full information maximum likelihood (FIML) [43]. Models capture both trajectory shape and individual membership in relation to different groups. We balanced information from model fit indices (e.g., Bayesian information criteria [BIC] and entropy) with previously defined criteria for model adequacy [43]. We first assessed the best-fitting model using BIC after fitting different permutations of polynomials (from linear, quadratic to cubic, and from 1 to 6 groups). Though a higher BIC value (less negative) was preferred, we also required the following [43]: (1) reasonable sample size for each group (over 1000 observations); (2) narrow confidence intervals in post-estimation plotting; (3) close correspondence between the estimated probability of group membership and the proportion assigned to that group based on the posterior probability of group membership; (4) the average of the posterior probabilities of group membership exceeds a minimum threshold of 0.7; (5) the odds of correct classification based on the posterior probabilities of group membership exceed 5. Detailed information on model selection was described in Additional file 1, Supplemental Methods [44–46], Tables S4-S5, Figures S5-S6. To achieve global maxima, after we ran the final selected model, we generated a new matrix of random start values using 0.002 as the amount of variability and reran the model with 10,000 iterations. We reported the results of GBTM according to the GRoLTS-Checklist for reporting on latent trajectory studies [47] (Additional file 2). After conducting the GBTM, we used "trajplot" in Stata to plot the trajectory groups. We then randomly selected 110 observations from each group and created a spaghetti plot with exact RCG z-scores.

The characteristics of the five trajectory groups were compared using the  $\chi^2$  tests for proportions, ANOVA tests for means, and Kruskal–Wallis tests for medians. No adjustments were made for the purpose of description. Statistical significance was defined as P < 0.05.

The odds ratios (ORs) and 95% confidence intervals (CIs) were calculated for the associations between different trajectory groups and both obstetric/neonatal complications and children's NDC outcomes using generalized estimating equation (GEE) models with logit link clustered on maternal identification number. We replaced the missing values in confounders with a dummy category. For model 1, we adjusted for birth year and child's sex. For model 2, we further adjusted for maternal age, education level, BMI, birth region, and parity, with maternal psychiatric history included in model 2 only when analyzing associations with NDCs.

In both Model 1 and Model 2 for obstetric/neonatal and NDC outcomes, we employed the Benjamini-Hochberg (BH) procedure [48] for controlling the false discovery rate (FDR) which entailed the correction of p-values in the context of multiple comparisons, thereby facilitating efficient control of the FDR.

#### Sensitivity analysis

The Stata "traj" plugin uses FIML to handle missing values. To investigate the influence of missing values during different time periods on the model's parameter estimation and adequacy, we dropped observations with missing values or replaced them with extreme values (the smallest and largest values) during certain periods and replicated the analysis. To disentangle the effect of overweight/obesity in the associations with different outcomes, we further excluded those with overweight/ obesity and replicated our analyses. Furthermore, to investigate if the associations with offspring NDCs could be influenced by gestational hypertensive diseases, we excluded those exposed to gestational hypertensive diseases and replicated our analyses.

	Total population	Persistently low	Moderate	High in early pregnancy	High in mid-pregnancy	Persistently high	<i>P</i> -value <sup>a</sup>
Total		53,164	17,319	3178	1461	1106	
Maternal characteristics							
Maternal age, mean (SD)	31.3 (5.1)	31.3 (5.0)	31.5 (5.1)	31.9 (5.1)	31.5 (5.2)	31.8 (5.5)	< 0.001
Maternal BMI, <i>n</i> (%)							
Normal weight (18.5–24.9 kg/m <sup>2</sup> )	50,369 (66.1%)	36,532 (68.7%)	10,515 (60.7%)	2007 (63.2%)	856 (58.6%)	459 (41.5%)	< 0.001
Underweight (< 18.5 kg/m <sup>2</sup> )	2215 (2.9%)	1619 (3.0%)	424 (2.4%)	108 (3.4%)	36 (2.5%)	28 (2.5%)	
Overweight (25.0– 29.9 kg/m²)	16,072 (21.1%)	10,456 (19.7%)	4209 (24.3%)	690 (21.7%)	349 (23.9%)	368 (33.3%)	
Obese (≥ 30 kg/m²)	6158 (8.1%)	3611 (6.8%)	1810 (10.5%)	316 (9.9%)	185 (12.7%)	236 (21.3%)	
Missing	1414 (1.9%)	946 (1.8%)	361 (2.1%)	57 (1.8%)	35 (2.4%)	15 (1.4%)	
Maternal birth region,	u (%)						
Nordic	56,517 (74.1%)	41,104 (77.3%)	11,827 (68.3%)	2171 (68.3%)	885 (60.6%)	530 (47.9%)	< 0.001
Europe	4567 (6.0%)	3159 (5.9%)	1074 (6.2%)	188 (5.9%)	92 (6.3%)	54 (4.9%)	
Africa	3712 (4.9%)	1979 (3.7%)	1188 (6.9%)	232 (7.3%)	145 (9.9%)	168 (15.2%)	
Asia	9331 (12.2%)	5511 (10.4%)	2731 (15.8%)	501 (15.8%)	286 (19.6%)	302 (27.3%)	
Other	2094 (2.7%)	1405 (2.6%)	499 (2.9%)	86 (2.7%)	52 (3.6%)	52 (4.7%)	
Missing	7 (<1%)	6 (0.01%)	0 (0:0%)	0 (0.0%)	<5 (0.1%)	0 (0.0%)	
Maternal psychiatric history, <i>n</i> (%)	7898 (10.4%)	5460 (10.3%)	1834 (10.6%)	315 (9.9%)	156 (10.7%)	133 (12.0%)	0.23
Maternal education lev	rel, n (%)						
Pre-high school	8066 (10.6%)	5220 (9.8%)	2066 (11.9%)	351 (11.0%)	222 (15.2%)	207 (18.7%)	< 0.001
High school	24,484 (32.1%)	16,743 (31.5%)	5748 (33.2%)	1088 (34.2%)	489 (33.5%)	416 (37.6%)	
Post-high school	43,232 (56.7%)	30,896 (58.1%)	9398 (54.3%)	1720 (54.1%)	742 (50.8%)	476 (43.0%)	
Missing	446 (0.6%)	305 (0.6%)	107 (0.6%)	19 (0.6%)	8 (0.5%)	7 (0.6%)	
Parity, <i>n</i> (%)							
Nulliparous	35,490 (46.6%)	25,015 (47.1%)	8079 (46.6%)	1240 (39.0%)	667 (45.7%)	489 (44.2%)	< 0.001
<b>,</b>	27,995 (36.7%)	19,665 (37.0%)	6224 (35.9%)	1264 (39.8%)	489 (33.5%)	353 (31.9%)	
≥2	12,743 (16.7%)	8484 (16.0%)	3016 (17.4%)	674 (21.2%)	305 (20.9%)	264 (23.9%)	
GDM, <i>n</i> (%)	219 (0.3%)	15 (0.03%)	42 (0.2%)	24 (0.8%)	36 (2.5%)	102 (9.2%)	< 0.001
RGWG-T2, mean (SD)	0.58 (0.27)	0.57 (0.27)	0.58 (0.29)	0.56 (0.29)	0.58 (0.30)	0.58 (0.33)	< 0.001
RGWG-T3, mean (SD)	0.52 (0.24)	0.52 (0.24)	0.54 (0.24)	0.50 (0.24)	0.52 (0.25)	0.55 (0.29)	< 0.001
Total GWG z-scores, mean (SD)	0.09 (1.02)	0.07 (1.02)	0.16 (1.03)	-0.00 (1.02)	0.10 (1.09)	0.22 (1.18)	< 0.001

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	Total population	Persistently low	Moderate	High in early pregnancy	High in mid-pregnancy	Persistently high	<i>P</i> -value <sup>a</sup>
Antidiabetic treatment,	n (%)						
No treatment	76,094 (99.8%)	53,132 (99.9%)	17,294 (99.9%)	3162 (99.5%)	1451 (99.3%)	1055 (95.4%)	< 0.001
≤ 20 wkGA	53 (0.1%)	30 (0.1%)	8 (0.05%)	10 (0.3%)	0 (0.0%)	5 (0.5%)	
> 20-28 wkGA	6 (< 1%)	< 5 (0.002%)	0 (0.0%)	<5 (0.1%)	< 5 (0.1%)	<5 (0.2%)	
> 28-34 wkGA	36 (< 1%)	0 (0.0%)	5 (0.03%)	<5 (0.1%)	6 (0.4%)	23 (2.1%)	
> 34 wkGA	39 (0.1%)	<5 (0.002%)	12 (0.1%)	<5 (0.1%)	< 5 (0.2%)	21 (1.9%)	
The earliest OGTT, <i>n</i> (%)							
No OGTT	74,104 (97.2%)	52,371 (98.5%)	16,667 (96.2%)	2954 (93.0%)	1276 (87.3%)	836 (75.6%)	< 0.001
≤ 20 wkGA	289 (0.4%)	81 (0.2%)	49 (0.3%)	129 (4.1%)	8 (0.5%)	22 (2.0%)	
> 20-28 wkGA	513 (0.7%)	172 (0.3%)	132 (0.8%)	36 (1.1%)	125 (8.6%)	48 (4.3%)	
> 28-34 wkGA	971 (1.3%)	416 (0.8%)	317 (1.8%)	44 (1.4%)	48 (3.3%)	146 (13.2%)	
> 34 wkGA	351 (0.5%)	124 (0.2%)	154 (0.9%)	15 (0.5%)	<5 (0.3%)	54 (4.9%)	
Gestational hyperten- sive diseases, <i>n</i> (%)	3742 (4.9%)	2525 (4.7%)	853 (4.9%)	157 (4.9%)	106 (7.3%)	101 (9.1%)	< 0.001
Mode of delivery, <i>n</i> (%)							
Unassisted vaginal delivery	47,417 (62.2%)	33,727 (63.4%)	10,340 (59.7%)	1954 (61.5%)	838 (57.4%)	558 (50.5%)	< 0.001
Induced vaginal delivery	7046 (9.2%)	4855 (9.1%)	1595 (9.2%)	315 (9.9%)	148 (10.1%)	133 (12.0%)	
Assisted vaginal delivery	7061 (9.3%)	4894 (9.2%)	1646 (9.5%)	279 (8.8%)	137 (9.4%)	105 (9.5%)	
Elective cesarean section	7664 (10.1%)	5141 (9.7%)	1879 (10.8%)	333 (10.5%)	169 (11.6%)	142 (12.8%)	
Emergency cesarean section	7040 (9.2%)	4547 (8.6%)	1859 (10.7%)	297 (9.3%)	169 (11.6%)	168 (15.2%)	
Long labor time, <i>n</i> (%)	1746 (2.3%)	1156 (2.2%)	449 (2.6%)	66 (2.1%)	39 (2.7%)	36 (3.3%)	0.002
Obstructed labor, n (%)	704 (0.9%)	416 (0.8%)	208 (1.2%)	36 (1.1%)	19 (1.3%)	25 (2.3%)	< 0.001
Children's characteristics							
Child's sex, <i>n</i> (%)							
Male	39,281 (51.5%)	27,328 (51.4%)	8978 (51.8%)	1625 (51.1%)	734 (50.2%)	616 (55.7%)	0.043
Female	36,947 (48.5%)	25,836 (48.6%)	8341 (48.2%)	1553 (48.9%)	727 (49.8%)	490 (44.3%)	
Gestational week at birt	:h, n (%)						
Preterm (< 37 weeks)	2544 (3.3%)	1759 (3.3%)	531 (3.1%)	117 (3.7%)	69 (4.7%)	68 (6.1%)	< 0.001
Term (37– <42 weeks)	68,870 (90.3%)	48,062 (90.4%)	15,677 (90.5%)	2853 (89.8%)	1305 (89.3%)	973 (88.0%)	
Post-term (≥ 42 weeks)	4814 (6.3%)	3343 (6.3%)	1111 (6.4%)	208 (6.5%)	87 (6.0%)	65 (5.9%)	

	Total population	Persistently low	Moderate	High in early pregnancy	High in mid-pregnancy	Persistently high	P-value <sup>a</sup>
Neonatal birth trauma, n (%)	1322 (1.7%)	817 (1.5%)	380 (2.2%)	66 (2.1%)	28 (1.9%)	31 (2.8%)	< 0.001
Size for gestational age	(%) u (%)						
AGA	72,382 (95.0%)	50,740 (95.4%)	16,312 (94.2%)	3000 (94.4%)	1350 (92.4%)	980 (88.6%)	< 0.001
SGA	1493 (2.0%)	1085 (2.0%)	287 (1.7%)	73 (2.3%)	32 (2.2%)	16 (1.4%)	
LGA	2223 (2.9%)	1254 (2.4%)	684 (3.9%)	98 (3.1%)	78 (5.3%)	109 (9.9%)	
Missing	130 (0.2%)	85 (0.2%)	36 (0.2%)	7 (0.2%)	< 5 (0.1%)	<5 (0.1%)	
Macrosomia (birthweig	ht > 4500 g), <i>n</i> (%)						
Yes	2328 (3.1%)	1380 (2.6%)	701 (4.0%)	108 (3.4%)	61 (4.2%)	78 (7.1%)	< 0.001
Missing	130 (0.2%)	85 (0.2%)	36 (0.2%)	7 (0.2%)	<5 (0.1%)	< 5 (0.1%)	
Apgar score at 5-min < 7, i	n (%)						
Yes	503 (0.7%)	327 (0.6%)	134 (0.8%)	20 (0.6%)	11 (0.8%)	11 (1.0%)	0.10
Missing	241 (0.3%)	160 (0.3%)	62 (0.4%)	15 (0.5%)	<5 (0.2%)	< 5 (0.1%)	
Neonatal hypoglyce- mia, <i>n</i> (%)	1637 (2.1%)	993 (1.9%)	433 (2.5%)	101 (3.2%)	39 (2.7%)	71 (6.4%)	< 0.001
Children's NDCs, <i>n</i> (%)							
Any NDCs	2890 (3.8%)	1929 (3.6%)	709 (4.1%)	132 (4.2%)	65 (4.4%)	55 (5.0%)	0.004
Any autism	1465 (1.9%)	997 (1.9%)	352 (2.0%)	66 (2.1%)	30 (2.1%)	20 (1.8%)	0.64
Any ID	404 (0.5%)	260 (0.5%)	104 (0.6%)	26 (0.8%)	9 (0.6%)	5 (0.5%)	0.066
Any ADHD	1758 (2.3%)	1160 (2.2%)	436 (2.5%)	84 (2.6%)	38 (2.6%)	40 (3.6%)	0.001
Autism only	820 (1.1%)	571 (1.1%)	188 (1.1%)	30 (0.9%)	19 (1.3%)	12 (1.1%)	0.87
ADHD only	1238 (1.6%)	809 (1.5%)	318 (1.8%)	51 (1.6%)	29 (2.0%)	31 (2.8%)	< 0.001
Autism and ADHD	428 (0.6%)	289 (0.5%)	(%)0066	25 (0.8%)	8 (0.5%)	7 (0.6%)	0.49
Abbreviations: GDM gestationi gestational weight gain (stanc small for gestational age, LGA <sup>a</sup> We applied $\chi^2$ tests for propu	I diabetes mellitus, <i>RGWG-T2</i> lardized by the gestational di large for gestational age, <i>wK</i> ortions and ANOVA tests for	r ate of gestational weight g uration), <i>ID</i> intellectual disab <i>5</i> A weeks of gestational age, means to compare NDC dia	ain in the second trimeste ility, <i>ADHD</i> attention-defic <i>SD</i> standard deviation, <i>IQ</i> / gnoses and maternal, obs	r (g/week), <i>RGWG-T3</i> rate of gesta it hyperactivity disorder, <i>ND</i> C neu interquartile range tetric, neonatal, and children's ch	tional weight gain in the third tr rodevelopmental conditions, <i>A</i> , iaracteristics among different tr	imester (g/week), <i>Total GWG z.</i> GA appropriate for gestational ajectory groups	-score total lage, SGA

Table 1 (continued)

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# Results

#### Population characteristics

Our final study sample included 76,228 children born to 68,768 mothers. GDM was diagnosed in 219 (0.3%) of the observed pregnancies. At the end of follow-up, the median age of the children was 7.6 (IQR 6.7-8.4) years old, among whom 1465 (1.96%) were diagnosed with autism, 1758 (2.34%) with ADHD, and 404 (0.55%) with ID (Table 1). Compared to those excluded because of missing RCG values, those included in the final sample had lower proportions of NDCs and overweight/ obese mothers, and higher proportions of well-educated and Nordic-born mothers (Additional file 1, Table S6). Of those included, 5.84%, 3.93%, 5.24%, and 9.44% were missing maternal RCG values within the time intervals of  $\leq 20$ , > 20-28, > 28-34, and > 34 wkGA, respectively. 71.5% children had complete records for maternal RCG across the four time intervals. Those missing RCG during each time interval differed from with observations, with patterns specific to each time interval (Additional file 1, Table S7). For example, children missing > 34 wkGA measurements were more likely to be born preterm compared to those with measurements (26.4% vs. 0.9%, P < 0.001), and children with missing values in the  $\leq 20$ and > 34 wkGA intervals were more likely to be diagnosed with an NDC compared to those without missing values (4.7% vs. 3.7% [P=0.002] and 4.5% vs. 3.7% [P<0.001], respectively). Children who were affected by NDCs differed from those unaffected in all covariates, except macrosomia, patterns of OGTT screening, and neonatal birth trauma (Additional file 1, Table S8).

#### **Trajectory model selection**

Our final model ultimately consisted of 5 groups with 5 cubic trajectories, as shown in Fig. 1A. Additional information on the parameter estimations, variancecovariance matrix, matrix of misclassification errors and model adequacy can be found in Additional file 1, Supplementary Methods, Table S9-12. Our final model had a reasonable sample size for each group (over 1000 observations) and narrow confidence intervals in postestimation plotting (Fig. 1A) with good correspondence between trajectory groups and observed patterns of glucose measurements (Fig. 1C). We observed close correspondence between the estimated probability of group membership and the proportion assigned to that group based on the posterior probability of group membership. The average of the posterior probabilities of group membership exceeded a minimum threshold of 0.7, and the odds of correct classification based on the posterior probabilities of group membership exceeded 5 for most of the groups, except for Group 1 ("Persistently Low").

# Patterns of distinct glucose trajectory groups

Group 1 (referent group, "Persistently Low") included 53,164 observations (64.9% of the cohort) with relatively low and stable maternal RCG levels throughout pregnancy. Group 2 ("Moderate") included 17,319 observations (25.6%) with a slightly higher maternal RCG at the baseline compared to Group 1 that slowly increased throughout pregnancy without an obvious peak, indicating a moderately higher RCG level, more likely to represent a subclinical hyperglycemic state. Group 3 ("High in Early Pregnancy") included 3178 observations (5.2%) with a high maternal RCG at baseline followed by a steep decrease from 20 wkGA until the end of pregnancy. Group 4 ("High in Mid-Pregnancy") included 1461 observations (2.5%) with a slightly higher baseline maternal RCG compared to Group 1, followed by a sharp increase between 20 and 28 wkGA with a return to baseline level afterwards. Group 5 ("Persistently High") included 1106 observations (1.7%) with a relatively high maternal RCG at the baseline, reaching a peak in the early third trimester followed by a slight drop at the end of pregnancy.

#### Characteristics of the distinct glucose trajectory groups

The proportions of maternal obesity varied in the trajectory groups, with 10.5%, 9.9%, 12.7%, and 21.3% in Group 2 ("Moderate"), Group 3 ("High in Early Pregnancy"), Group 4 ("High in Mid-Pregnancy"), and Group 5 ("Persistently High"), respectively (p < 0.001; Table 1). The proportion of Nordic-born mothers was 77.3% in Group 1, decreasing to 68.3%, 68.3%, 60.6%, and 47.9% in Groups 2 to 5, respectively (p < 0.001). Similarly, the proportion of women with pre-high school education in Group 1 was 9.8%, increasing to 11.9%, 11.0%, 15.2%, and 18.7% in Groups 2 to 5, respectively (p < 0.001). The rates of weight gain in trimesters 2 and 3 differed across different trajectory groups (p < 0.001for both trimesters), with the lowest rate of weight gain in both trimesters and the lowest total weight gain z-scores observed in Group 3 ("High in Early Pregnancy"). In Group 1, the proportion of GDM was 0.03%, while the proportions were 0.2%, 0.8%, 2.5%, and 9.2% in Groups 2 to 5, respectively. In Group 1, the proportion of OGTT referral was 1.5%, while the proportions were 3.8%, 7.0%, 12.7%, and 24.4% in Groups 2 to 5, respectively (Table 1). The proportion of individuals receiving antidiabetic treatments was generally low across different trajectory groups, though the proportion of those receiving treatment and the timing of the treatment did seem to vary across the groups. In Group 1, the proportion of antidiabetic treatment was 0.1%, which was similar to the proportion in Group 2. However, the proportions increased to 0.5%, 0.7%, and 4.6% in Groups 3 to 5, respectively. Women in Group 3 ("High in Early Pregnancy"), which had a drop in



Fig. 1 RCG z-score trajectory groups throughout pregnancy. A RCG z-score trajectory groups throughout pregnancy. B Proportions of Gestational diabetes mellitus in each trajectory group C To visualize the accuracy of assignment, Lasagne plots depicting the observed ZRCG throughout pregnancy for 110 randomly selected pregnancies from each trajectory group (restricted to aid the clarity of the plot) were compared to post-estimation plots

glucose level after hyperglycemia identified  $\leq$  20 wkGA, were more likely to be treated in early pregnancy ( $\leq$  20 wkGA). Women in Group 4 ("High in Mid-Pregnancy"), which had a drop in glucose level after hyperglycemia identified > 20–28 wkGA, were more likely to receive antidiabetic treatments during the early third trimester. Finally, women in Group 5, which had a peak in early third trimester between > 28–34 wkGA followed by a slight drop in RCG level, were more likely to receive treatment after 28 wkGA.

# Maternal glucose trajectory groups and obstetric and neonatal outcomes

# Maternal outcomes

Compared to Group 1 ("Persistently Low"), Group 2 ("Moderate") was not associated with gestational hypertensive diseases, or induced vaginal delivery, but was associated with assisted vaginal delivery (OR 1.08, 95% CI 1.02–1.15, P=0.013), cesarean section (OR 1.15, 95% CI 1.10–1.20, P<0.001), long labor time (OR 1.14, 95% CI 1.02–1.28, P=0.023), and obstructed labor (OR 1.45, 95%

CI 1.22–1.71, P<0.001). However, all these associations remained significant after accounting for FDR except for the long labor time.

Group 3 ("High in Early Pregnancy") was not associated with gestational hypertensive diseases, induced vaginal delivery, assisted vaginal delivery, or long labor time, but was associated with cesarean section (OR 1.11, 95% CI 1.01–1.21, P=0.029), and obstructed labor (OR 1.51, 95% CI 1.07–2.13, P=0.018). However, neither of the associations remained significant after accounting for FDR.

Group 4 ("High in Mid-pregnancy") was not associated with induced vaginal delivery, assisted vaginal delivery, long labor time, or obstructed labor, but was associated with gestational hypertensive diseases (OR 1.48, 95% CI 1.20–1.82, P<0.001), and cesarean section (OR 1.24, 95% CI 1.09–1.40, P=0.001), which remained significant after accounting for FDR.

Group 5 ("Persistently High") was not associated with long labor time but was associated with all the other maternal outcomes. However, only associations with gestational hypertensive diseases (OR 1.73, 95% CI 1.40–2.15, P<0.001), induced vaginal delivery (OR 1.36, 95% CI 1.12–1.66, P=0.002), cesarean section (OR 1.48, 95% CI 1.29–1.71, P<0.001), and obstructed labor (OR 2.46, 95% CI 1.62–3.74, P<0.001) remained significant after accounting for FDR (Fig. 2).

# Neonatal outcomes

Compared to Group 1 ("Persistently Low"), Group 2 ("Moderate") was not associated with increased risk of 5-min Apgar score <7, but associated with all the other neonatal outcomes. However, only the associations with SGA (OR 0.74, 95% CI 0.65–0.85, P<0.001), LGA (OR 1.61, 95% CI 1.46–1.77, P<0.001), macrosomia (OR 1.55, 95% CI 1.41–1.71, P<0.001), neonatal birth trauma (OR 1.40, 95% CI 1.23–1.58, P<0.001), and neonatal hypoglycemia (OR 1.23, 95% CI 1.09–1.38, P=0.001) remained significant after accounting for FDR.

Group 3 ("High in Early Pregnancy") was not associated with preterm birth, SGA, or 5-min Apgar score <7, but associated with LGA, macrosomia, neonatal birth trauma, and neonatal hypoglycemia. However, only the association with macrosomia (OR 1.29, 95% CI 1.05–1.57, P=0.014), neonatal birth trauma (OR 1.42, 95% CI 1.10–1.83, P=0.007), and neonatal hypoglycemia (OR 1.66, 95% CI 1.35–2.05, P<0.001) remained significant after accounting for FDR.

Group 4 ("High in Mid-Pregnancy") was not associated with SGA, neonatal birth trauma, 5-min Apgar score <7, or neonatal hypoglycemia, but associated with preterm birth (OR 1.38, 95% CI 1.08–1.77, P=0.011), LGA (OR 2.28, 95% CI 1.79–2.89, P<0.001), and macrosomia (OR

1.65, 95% CI 1.26–2.15, P<0.001). All these associations remained significant after accounting for FDR.

Group 5 ("Persistently High") was not associated with 5-min Apgar score <7 but associated with all the other neonatal outcomes, including preterm birth (OR 1.70, 95% CI 1.32–2.20, P<0.001), SGA (OR 0.56, 95% CI 0.34–0.92, P=0.023), LGA (OR 4.01, 95% CI 3.23–4.99, P<0.001), macrosomia (OR 2.73, 95% CI 2.13–3.49, P<0.001), neonatal birth trauma (OR 1.67, 95% CI 1.15–2.41, P=0.007), and neonatal hypoglycemia (OR 2.68, 95% CI 2.08–3.46, P<0.001). All these associations remained significant after accounting for FDR except for SGA (Fig. 3).

# Maternal glucose trajectory groups and children's risks of NDCs

Compared to Group 1 ("Persistently Low"), Group 2 ("Moderate") was associated with "ADHD only" (OR 1.16, 95% CI 1.01–1.32, P=0.033), but not associated with any other NDCs. Group 3 ("High in Early Pregnancy") was associated with "Any ID" (OR 1.51, 95% CI 1.01–2.26, P=0.047), "Any ADHD" (OR 1.29, 95% CI 1.03–1.62, P=0.029), and "Autism and ADHD" (OR 1.56, 95% CI 1.03–2.36, P=0.035), but not associated with any other NDCs. Group 4 ("High in Mid-Pregnancy") was not associated with any of these NDCs. Group 5 ("Persistently High") was associated with "ADHD only" (OR 1.54, 95% CI 1.06–2.24, P=0.024), but not associated with any other NDCs. However, none of the associations with NDC outcomes remained significant after accounting for FDR (Fig. 4).

#### Sensitivity analysis

After excluding individuals with missing RCG values at any of the four intervals ( $N_{\text{excluded}} = 18,652$ ), we observed the same pattern for the five trajectory groups (Additional file 1, Fig S7B), albeit with a better model adequacy (Additional file 1, Table S12). Replacing missing values with either the smallest or largest values of each time interval did not significantly change the shape or adequacy of trajectory models (Additional file 1, Fig S7C- S7D, and Table S12). After excluding individuals with overweight and obese mothers, associations with obstetric and neonatal outcomes remained broadly similar to the main findings, except for the associations with severe outcomes (e.g., gestational hypertensive disease, preterm birth) and induced vaginal delivery, which became insignificant after FDR adjustment (Additional file 1, Table S13). The associations between "Group 3" and both "Any ADHD" and "Autism and ADHD" became statistically significant (Additional file 1, Table S13). After excluding individuals exposed to gestational hypertensive diseases, the associations with offspring NDCs largely

		OR (95% CI)	P BH-P
Hypertensive disease G1 (Persistently Low)	•	Ref.	
G2 (Moderate)	•	1.04 (0.96-1.12) 0.98 (0.91-1.07)	0.351 0.460 0.691 0.801
G3 (High in Early Preg.)	•	1.04 (0.89-1.23)	0.604 0.690
G4 (High in Mid-Preg.)	•	1.54 (1.26-1.88)	<0.001 <0.001
G5 (Persistently High)	•	1.98 (1.61-2.44) 1.73 (1.40-2.15)	<0.001 <0.001 <0.001 <0.001
Induced vaginal G1 (Persistently Low)	     	Ref.	
G2 (Moderate)	•	1.07 (1.00-1.13) 1.01 (0.95-1.07)	0.041 0.078 0.835 0.915
G3 (High in Early Preg.)	•	1.12 (0.99-1.27) 1.06 (0.94-1.20)	0.071 0.123 0.356 0.521
G4 (High in Mid-Preg.)	↓ <b>●</b> ◆	1.22 (1.02-1.45) 1.11 (0.93-1.33)	0.030 0.061 0.260 0.408
G5 (Persistently High)	 	1.63 (1.35-1.98) 1.36 (1.12-1.66)	<0.001 <0.001 0.002 0.008
Assisted vaginal G1 (Persistently Low)	•	Ref.	
G2 (Moderate)	•	1.10 (1.03-1.16) 1.08 (1.02-1.15)	0.003 0.010 0.013 0.044
G3 (High in Early Preg.)	•	0.99 (0.87-1.12)	0.833 0.889 0.123 0.224
G4 (High in Mid-Preg.)	↓	1.13 (0.94-1.35) 1.16 (0.95-1.40)	0.199 0.306 0.142 0.252
G5 (Persistently High)	•	1.28 (1.04-1.58) 1.26 (1.01-1.59)	0.022 0.050 0.041 0.092
Caesarean section G1 (Persistently Low)	•	Ref.	
G2 (Moderate)	•	1.22 (1.17-1.28) 1.15 (1.10-1.20)	<0.001 <0.001 <0.001 <0.001
G3 (High in Early Preg.)	<b>o</b>		0.007 0.021 0.029 0.073
G4 (High in Mid-Preg.)	•	1.34 (1.18-1.51) 1.24 (1.09-1.40)	<0.001 <0.001 0.001 0.004
G5 (Persistently High)	*	1.76 (1.54-2.02) 1.48 (1.29-1.71)	<0.001 <0.001 <0.001 <0.001
Long labour G1 (Persistently Low)	•	Ref.	
G2 (Moderate)	•	1.20 (1.07-1.34) 1.14 (1.02-1.28)	0.001 0.006 0.023 0.066
G3 (High in Early Preg.)		0.95 (0.74-1.22) 1.05 (0.81-1.35)	0.695 0.783 0.720 0.820
G4 (High in Mid-Preg.)		1.23 (0.89-1.71) 1.16 (0.83-1.61)	0.203 0.306 0.380 0.533
G5 (Persistently High)	- <b>•</b> -	1.51 (1.08-2.12) 1.33 (0.94-1.88)	0.016 0.039 0.105 0.200
Obstructed labour G1 (Persistently Low)	•	Ref.	
G2 (Moderate)	<b>◆</b>	1.54 (1.30-1.82) 1.45 (1.22-1.71)	<0.001 <0.001 <0.001 <0.001
G3 (High in Early Preg.)	- <b>o</b>	1.47 (1.04-2.07) 1.51 (1.07-2.13)	0.028 0.059 0.018 0.057
G4 (High in Mid-Preg.)	- <b>•</b>	1.67 (1.05-2.66) 1.55 (0.97-2.47)	0.030 0.061 0.066 0.135
G5 (Persistently High)		- 2.89 (1.92-4.35) - 2.46 (1.62-3.74)	<0.001 <0.001 <0.001 <0.001
	.5 1 2 3	5	

Model 1 Model 2

**Fig. 2** Odds ratios (ORs) and 95% confidence intervals (Cls) for the associations between maternal RCG *z*-score trajectory groups and maternal outcomes. GEE model, clustered on maternal identification numbers. Model 1: adjusted for child's sex, birth year. Model 2: adjusted for model 1 and maternal birth region, maternal age, maternal education level, maternal BMI, and parity. *P*-values after applying the Benjamini-Hochberg (BH) procedure for controlling FDR are presented

remained similar to the main findings (Additional file 1, Table S14).

# Discussion

We observed five distinct patterns of glucose trajectories throughout pregnancy. Higher odds of obstetric and neonatal complications were not only associated with the "Persistently High" group, but also with the "Moderate," "High in Early Pregnancy," and "High in Mid-Pregnancy" groups to differing degrees compared to the referent "Persistently Low" group. These trajectory groups, except for the "High in Mid-Pregnancy" group, were also associated with increased children's odds of NDCs in the long term, though none of these associations remained statistically significant after accounting for FDR.

# Interpretation of findings

Previous research on maternal hyperglycemia and related risks primarily focused on clinical GDM diagnosis. Although some studies linked subclinical glucose levels to obstetric/neonatal complications, they relied on single-point measurements [5, 49, 50]. One study found associations between high fasting glucose trajectories and perinatal outcomes (i.e., LGA and macrosomia) [51]. However, no studies, to our knowledge, explored the association between glucose trajectories across pregnancy and children's NDC risk.

Group 2, featuring subclinical hyperglycemia with glucose levels ranging from 0 to +1 standard deviation (SD), and low GDM diagnosis rate, still indicated raised risks of fetal overgrowth and birth complications, albeit not severe complications (e.g., gestational hypertensive diseases and preterm birth), consistent with the associations observed for mid-pregnancy glucose levels reported in the HAPO study [5]. Even after excluding overweight/ obese mothers, these associations remained, emphasizing that persistent subclinical hyperglycemia could influence fetal growth and birth even in a low-risk group. Given IADPSG's GDM diagnostic cut-offs, this group might be overlooked in clinical settings, yet clinical trial reviews indicate dietary advice and glucose monitoring can mitigate macrosomic and LGA babies in this group without raising operation rates [52]. However, current GDM diagnostic criteria necessitate updated clinical trials [53].

<b>.</b>		OR (95% CI)	P BH-P
G1 (Persistently Low)	•	Ref.	
G2 (Moderate)	*	0.93 (0.84-1.02) 0.90 (0.81-0.99)	0.120 0.196 0.029 0.073
G3 (High in Early Preg.)	\$	1.12 (0.93-1.36) 1.13 (0.93-1.37)	0.246 0.358 0.215 0.358
G4 (High in Mid-Preg.)	•	1.44 (1.12-1.84) 1.38 (1.08-1.77)	0.004 0.013 0.011 0.039
G5 (Persistently High)	•	1.87 (1.45-2.40)	<0.001 <0.001 <0.001 <0.001
SGA			
G1 (Persistently Low)	÷	Ref.	0.000 0.011
G2 (Moderate)	• •	0.82 (0.72-0.94) 0.74 (0.65-0.85)	<pre>0.003 0.011 &lt;0.001 &lt;0.001</pre>
G3 (High in Early Preg.)	•	1.10 (0.86-1.40)	0.291 0.395
G4 (High in Mid-Preg.)	<b></b>	0.94 (0.66-1.34)	0.559 0.658
G5 (Persistently High)	•	0.76 (0.46-1.26) 0.56 (0.34-0.92)	$0.286 \ \ 0.394 \\ 0.023 \ \ 0.066$
G1 (Persistently Low)	•	Ref.	
G2 (Moderate)	•	1.67 (1.52-1.83) 1.61 (1.46-1.77)	<0.001 <0.001 <0.001 <0.001
G3 (High in Early Preg.)	¢	1.33 (1.08-1.63) 1.24 (1.01-1.53)	0.007 0.020 0.042 0.092
G4 (High in Mid-Preg.)	•	2.30 (1.82-2.91) 2.28 (1.79-2.89)	<0.001 <0.001 <0.001 <0.001
G5 (Persistently High)	•	4.31 (3.50-5.31) 4.01 (3.23-4.99)	<0.001 <0.001 <0.001 <0.001
Macrosomia (>4.5 kg) G1 (Persistently Low)		Ref.	
G2 (Moderate)	Ĭ	1.56 (1.42-1.71)	<0.001<0.001
G3 (High in Early Preg.)	•	1.32 (1.08-1.61)	0.007 0.020
G4 (High in Mid-Preg.)		1.63 (1.25-2.12)	<0.001 0.001 <0.001 0.001
G5 (Persistently High)		2.70 (2.13-3.43)	<0.001 <0.001
<b>Birth trauma</b> G1 (Persistently Low)		Ref.	
G2 (Moderate)	•	1.45 (1.28-1.63) 1.40 (1.23-1.58)	<0.001<0.001
G3 (High in Early Preg.)	•	1.37 (1.07-1.77)	0.014 0.036
G4 (High in Mid-Preg.)	•	1.26 (0.86-1.85)	0.228 0.338 0.335 0.515
G5 (Persistently High)	<b>♦</b>	1.84 (1.28-2.65) 1.67 (1.15-2.41)	0.001 0.004 0.007 0.025
5-minute Apgar score<7 G1 (Persistently Low)	•	Ref.	
G2 (Moderate)		1.26 (1.03-1.54) 1.18 (0.96-1.45)	0.027 0.059
G3 (High in Early Preg.)	\$	1.03 (0.65-1.62) 1.01 (0.64-1.59)	0.906 0.941
G4 (High in Mid-Preg.)	<b>↓</b>	1.22 (0.67-2.23)	0.520 0.630 0.767 0.852
G5 (Persistently High)	• •	1.60 (0.87-2.92) 1.35 (0.73-2.49)	0.129 0.206 0.341 0.515
Hypoglycemia G1 (Persistently Low)		Ref.	
G2 (Moderate)	le le	1.34 (1.20-1.50)	<0.001 <0.001
G3 (High in Early Preg.)		1.72 (1.40-2.12)	<0.001 <0.002
G4 (High in Mid-Preg.)	<b>↓</b>	1.44 (1.04-1.99)	0.028 0.059
G5 (Persistently High)		3.52 (2.74-4.51)	<0.001 <0.001
	.51 235	2.00 (2.00 <sup>-</sup> 0. <del>1</del> 0)	20.001 20.001

Model 1 Model 2

**Fig. 3** Odds ratios (ORs) and 95% confidence intervals (Cls) for the associations between maternal RCG *z*-score trajectory groups and neonatal complications. GEE model, clustered on maternal identification numbers. Model 1: adjusted for child's sex, birth year. Model 2: adjusted for model 1 and maternal birth region, maternal age, maternal education level, maternal BMI, and parity. *P*-values after applying the Benjamini-Hochberg (BH) procedure for controlling FDR are presented

Therefore, expectant mothers with moderately high glucose levels, typically undiagnosed with GDM, need clinical attention and potential lifestyle interventions.

Early pregnancy hyperglycemia (Group 3), marked by a glucose peak near + 2 SD, could be due to overt diabetes first identified in pregnancy [23]. The weight gain rates in this group, suggesting response to early pregnancy interventions, were not as high as in other groups. This group did not display increased risk for severe outcomes like gestational hypertensive diseases or preterm birth, indicating early glucose management benefits. Macrosomia and neonatal hypoglycemia risks persisted even after excluding overweight/obese mothers. Potential mechanisms might involve early onset fetal hyperinsulinemia influencing fetal glucose uptake, which could potentially mask a GDM diagnosis [54]. Mitigating fetal hyperinsulinemia effects in cases of early hyperglycemia may be challenging [54].

Mothers with high RCG levels peaking above+2 SD in mid-pregnancy (Group 4) showed increased odds for several complications, though less than persistently high RCG group, underscoring potential benefits of glucose management after high mid-pregnancy levels detection. Previous studies showed that optimal GDM management can reduce perinatal complications like preeclampsia [30] and preterm birth [29]. Mid-pregnancy-focused screening programs could detect this group effectively as well as those with persistently high levels. Our results distinguished risk levels for persistently high glucose levels from transiently high mid-pregnancy levels, revealing higher risks in the former, adding nuance to the insights provided by studies which focus on mid-pregnancy [5]. Even after excluding overweight/obese mothers, LGA and macrosomia associations persisted, suggesting midpregnancy hyperglycemia can influence fetal growth, even with later glycemic control.

The "Persistently High" group (Group 5), with glucose levels on average initially at+1 SD and escalating beyond+2 SD in late pregnancy, showed the highest associations with obstetric and neonatal complications. These observations aligned with the known risks of slightly elevated glucose levels and overt GDM (though less than 10% of mothers in this group were diagnosed with GDM) [5]. These risks regarding fetal overgrowth

		OR (95% CI)	Р	BH-P
Any NDCs G1 (Persistently Low)		Ref.		
G2 (Moderate)	\$	1.11 (1.02-1.21) 1.06 (0.97-1.16)	0.022 0.215	0.050 0.358
G3 (High in Early Preg.)	\$	1.18 (0.98-1.41)	0.074	0.125
G4 (High in Mid-Preg.)	\$	1.20 (0.93-1.55)	0.169	0.265
G5 (Persistently High)	\$	1.30 (0.99-1.72)	0.062	0.110
Any autism G1 (Persistently Low)	•	Ref.		
G2 (Moderate)	•	1.07 (0.95-1.21)	0.259 0.899	0.370
G3 (High in Early Preg.)	•	-1.13 (0.88-1.46) 1.12 (0.87-1.44)	0.337	0.449
G4 (High in Mid-Preg.)	*	1.11 (0.77-1.60)	0.583	0.676
G5 (Persistently High)	-	0.92 (0.59-1.44)	0.729	0.810
<b>Any ID</b> G1 (Persistently Low)	•	Ref.		
G2 (Moderate)	,	1.23 (0.98-1.55)	0.077	0.128
G3 (High in Early Preg.)		-1.72 (1.15-2.57)	0.009	0.024
G4 (High in Mid-Preg.)	_≁ _≁	1.26 (0.64-2.47)	0.500	0.615
G5 (Persistently High)	_ <b>←</b>	0.91 (0.37-2.21)	0.832	0.889
Any ADHD G1 (Persistently Low)		Ref.	0.202	01100
G2 (Moderate)		1.13 (1.01-1.26)	0.038	0.075
G3 (High in Early Preg.)		1.26 (1.01-1.58)	0.044	0.082
G4 (High in Mid-Preg.)	Ě	-1.14(0.82-1.58)	0.451	0.573
G5 (Persistently High)		1.56 (1.13-2.15)	0.007	0.020
Autism only G1 (Persistently Low)		Ref.	0.003	0.100
G2 (Moderate)		1.00 (0.85-1.19)	0.961	0.973
G3 (High in Early Preg.)		0.88 (0.61-1.27)	0.494	0.615
G4 (High in Mid-Preg.)		-1.23 (0.78-1.95) 1 13 (0.71-1.79)	0.372	0.480
G5 (Persistently High)		0.98 (0.56-1.74)	0.958	0.973
ADHD only			0.400	0.000
G1 (Persistently Low)	Ŷ	Ref.		
G2 (Moderate)	¢	1.18 (1.03-1.34) 1.16 (1.01-1.32)	0.016 0.033	$0.039 \\ 0.080$
G3 (High in Early Preg.)	•	1.09 (0.82-1.45) 1.12 (0.84-1.50)	0.558 0.442	$0.658 \\ 0.596$
G4 (High in Mid-Preg.)	*	1.23 (0.85-1.80) 1.20 (0.82-1.75)	0.276 0.358	0.387 0.521
G5 (Persistently High)	+	1.73 (1.20-2.49) 1.54 (1.06-2.24)	0.003 0.024	0.011 0.067
Autism and ADHD G1 (Persistently Low)	•	Ref.		
G2 (Moderate)	\$	1.04 (0.82-1.30) 1.02 (0.81-1.28)	0.765 0.875	0.838 0.946
G3 (High in Early Preg.)	  ∳-	1.51 (1.00-2.28) 1.56 (1.03-2.36)	0.048 0.035	0.087 0.082
G4 (High in Mid-Preg.)	-	1.00 (0.50-2.02) 0.96 (0.48-1.95)	0.995 0.918	0.995 0.966
G5 (Persistently High)	-	1.07 (0.51-2.28) 0.97 (0.45-2.09)	0.853 0.947	0.898 0.974
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1

Model 1 Model 2

**Fig. 4** Odds ratios (ORs) and 95% confidence intervals (Cls) for the associations between maternal RCG *z*-score trajectory groups and NDCs in offspring. GEE model, clustered on maternal identification numbers. Model 1: adjusted for child's sex and birth year. Model 2: adjusted for model 1 and maternal birth region, maternal age, maternal education level, maternal BMI, maternal psychiatric history, and parity. *P*-values after applying the Benjamini-Hochberg (BH) procedure for controlling FDR are presented

and birth complications persisted even when mothers with overweight/obesity were excluded. Despite this, only 4.6% received antidiabetic treatments, mostly post-28 wkGA, which aligned with a minor drop in RCG levels. Therefore, for this group, earlier monitoring and intervention may be crucial.

None of the associations with offspring NDCs remained significant after FDR corrections given our small sample size in which to study rare NDC outcomes. Here we cautiously note several associations that are consistent with previous findings in the literature for overt GDM diagnoses that warrant further exploration in larger studies. Both Group 2 (0 to +1 SD glucose levels) and Group 5 (+1 SD early, above +2 SD late) showed "ADHD only" associations, more so in Group 5. These findings aligned with prior GDM studies and Xiang et al's increased ADHD risk with medicated GDM (considered as a marker of severe GDM), though the efficacy of treatment was unclear [13]. Group 4 had no NDC associations, implying mid-pregnancy glycemic control's benefits to fetal neurodevelopment. However, we observed signals indicating that early pregnancy hyperglycemia was associated with NDCs despite subsequent glycemic control, including an association after excluding those with maternal overweight/obesity. Mechanisms to explain an association between maternal hyperglycemia and children's risks of NDCs remain unclear but may be related to diabetic embryopathy [16] or perinatal complications. While our study detected risks for perinatal complications associated with different maternal glucose trajectories, we lacked power for formal mediation analyses.

## Methodology considerations for GBTM

GDM links to both short-term and long-term complications, making glucose trajectories vital as they offer insight into hyperglycemia's timing, severity, and control. We used GBTM, a suitable tool that studies these patterns without trajectory distribution assumptions, given that such trajectories have never been studied before. Previous studies have reported that the selection of trajectory groups and population distribution across

different classes were relatively robust across different software packages [55], though we only used a single software package. This model, frequently used in clinical research [43], recognizes different developmental courses of disease and does not assume a one-size-fits-all model. Such taxonomy primarily highlights differences in causes and outcomes of varying developmental trajectories, rather than implying entirely distinct population groups. However, GBTM has limitations [55, 56], such as assuming constant change rate and similar trajectory within a cluster. The Latent Growth Mixture Model (LGMM) offers another approach to identify trajectories, providing evaluation of individual-level variance within each trajectory, though it has more convergence issues and is more computationally demanding [47]. The choice between LGMM and GBTM depends on the scenario [57].

Vermunt et al. suggested a three-step approach to improve the prediction of class membership by incorporating misclassification errors in group membership [58]. To simplify, we used GEE models to investigate associations, adjusting for confounders and correcting for clustering of different children within the same mother instead of including outcomes and covariates in the GBTM and assessing risks of outcomes through postestimation as would be done in a three-step approach. These models correct the standard error for clustering of different children within the same mother and are adjusted for potential confounders. However, our approach does not take misclassification errors into account during further analysis for different outcomes of interest, which is a limitation of this study and should be considered in future studies. A previous study demonstrated that the one-step approach is as efficient as the three-step method for model entropies of 0.6 or higher, with comparable results when entropy exceeds 0.80 [59]. We followed Nagin et al.'s criteria for model selection in GBTM [43], achieving a near-adequate fit with mismatch rates between 0.3 and 4.8%. The observed misclassification errors may drive associations towards null. However, the missing RCG values had minimal impact on model fitting.

#### Strengths and limitations

This is the first study, to our knowledge, investigating glucose patterns throughout pregnancy and their related complications in mothers and children. We are unaware of any studies of risks of offspring NDCs in relation to maternal glucose measurements. Utilizing regional antenatal care records in our large register linkage, we obtained detailed information about maternal RCG levels and confounders collected prospectively relative to the outcomes, for a total population sample. While OGTT tests are the gold standard for insulin resistance, their longitudinal use at multiple antenatal visits is impractical. We used RCG instead, offering a continuous pregnancywide glucose variance rather than a single point measurement. While the quality and timing of the last food intake impact RCG levels, this was mitigated by standardizing RCG values. By excluding overweight or obese subjects in sensitivity analyses, we focused on hyperglycemia's effects, disentangling the impact of overweight/obesity in associations.

Our findings should be interpreted in light of several limitations. Excluding women with RCG measurements missing in more than one time frame yielded a sample skewed towards Nordic-born mothers, prompting a need for replication in diverse populations to verify the generalizability of our findings. The study's limited sample size prevented us from assessing confounding familial factors (e.g., genetics and environment) with sibling comparisons, as only 19% of the children had siblings born within the same range of years when data were available. Adjusting for maternal birth region [60], pregestational BMI [9, 12], and maternal psychiatric history as proxies for genetic liability has likely partially addressed these issues, though this remains a key issue to address in future studies.

In this study, we only included information on antidiabetic treatments to explain potential glycemic control in different trajectory groups but did not adjust for it because few women were treated with antidiabetic medications. Our inability to source information on nutritional or lifestyle interventions limited our interpretation of results, especially for groups who experienced elevated blood glucose levels followed by lower levels later in pregnancy. We suspect glucose drops are due to intentional control and interventions rather than physiological changes, given the increasing insulin resistance during pregnancy [61, 62].

While most obstetric/neonatal outcomes followed glucose variance identification, we could not determine the temporal relationship for some outcomes, like gestational hypertensive diseases. Even though hyperglycemia and hypertensive diseases might share common causes [63, 64], their causal relationship was not well-established. However, after excluding those with gestational hypertensive diseases, the associations between glucose trajectories and offspring NDCs were consistent with our primary findings.

While we set criteria for the minimum size of each trajectory group, linking the groups with proportionally fewer mothers to relatively rare NDC outcomes in children could introduce statistical power issues in assessing these associations. Some outcomes were broadly defined by combining sub-diagnoses, like obstructed labor due to various causes, as we lacked adequate power to investigate each sub-diagnosis. Despite children being of diagnosable age by the end of follow-up, the study's follow-up time was less than ideal for register-based studies of NDCs, as past studies indicated lower NDC diagnoses in 7- to 9-year-olds compared to adolescents [6, 33]. Although the study detected an increased risk of perinatal complications and some NDC outcomes, it lacked the power for formal mediation analyses, suggesting the need for future studies with larger sample size.

# Conclusions

In summary, the associations between glucose trajectories indicating maternal hyperglycemia and the risks of shortterm obstetric/neonatal complications and long-term NDCs in children depend on the severity, duration, timing of occurrence, and effective control of hyperglycemia during pregnancy. Our study highlights the importance of monitoring and controlling maternal glucose levels throughout pregnancy, as elevated levels at different stages may have different impacts on maternal and children's outcomes. It also underscores the need for careful obstetric management in cases of moderately elevated glucose levels during pregnancy, which can complicate fetal growth and birth. Furthermore, the study highlights the importance of adopting individualized management approaches for women with different glucose trajectories during pregnancy, considering their specific risk profiles.

#### Abbreviations

ADHD	Attention-deficit/hyperactivity disorders
AGA	Appropriate for gestational age
BMI	Body mass index
CI	Confidence interval
GBTM	Group-based trajectory modeling
GDM	Gestational diabetes mellitus
GWG	Gestational weight gain
ICD	International Classification of Diseases
ID	Intellectual disability
IQR	Interquartile rang
LGA	Large for gestational age
NDC	Neurodevelopmental conditions
OGTT	Oral glucose tolerance test
OR	Odds ratio
RGWG-T2	Rate of gestational weight gain in the second trimester
RGWG-T3	Rate of gestational weight gain in the third trimester
RPG	Random capillary glucose
SD	Standard deviation
SGA	Small for gestational age
wkGA	Weeks of gestational age

# **Supplementary Information**

The online version contains supplementary material available at https://doi. org/10.1186/s12916-023-02926-3.

Additional file 1: Supplementary Methods & Table S1-S14 & Figure S1-S7. Supplementary Methods-group-based trajectory modeling. The procedure involved in group-based trajectory modeling. Table S1. A description of random capillary glucose measurements. A description of

random capillary glucose measurements during the entire pregnancy. Table S2. RCG values. Testing hour-standardized RCG z-scores and original RCG valuesmeasured at different times throughout the day. Table S3. Diagnostic codes. Diagnostic codes and register databases used to ascertain diagnoses within the Stockholm Youth Cohort. Table S4. Details of the selected group-based trajectory models. The details of the three best models for each group-based trajectory model with different numbers of groups. Table S5. Model adequacy for selected models. The model adequacy of the 5-group and the 6-group model. Table S6. Characteristics of offspring born to mothers with or without missing RCG level data. Characteristics of offspring whose mothers had no missing values in random capillary glucose level, with 1 missing value, or with more than 1 missing values in different time intervalsduring pregnancy. Table S7. Characteristics of offspring whose mothers have or do not have missing RCG level values within each time frame. Characteristics of offspring whose mothers had missing values in random capillary glucose levels during  $\leq 20, >20-28,$ >28-34, and >34 wkGA throughout pregnancy. Table S8. Characteristics of the study sample. The Characteristics of the final study sample. Table S9. The parameter estimation. The parameter estimation of the final trajectory model. Table S10. The variance and covariance matrix. The variance and covariance matrix of the final trajectory model. Table S11. The misclassification error matrix. The misclassification error matrix of the final trajectory model. Table S12. Statistics for model adequacy. Statistics for the adequacy of the final trajectory model, considering scenarios where missing values were replaced with either the smallest or largest RCG levels within each time frame, or where instances with missing values were excluded altogether. Table S13. Sensitivity analysis by excluding women with overweight/obesity. The sensitivity analysis of the association between trajectory groups and obstetric/neonatal outcomes and offspring NDCs outcomes by excluding women with overweight/obesity. Table S14. Sensitivity analysis by excluding gestational hypertensive diseases. Sensitivity analysis for the association between glucose trajectories and offspring NDCs by excluding gestational hypertensive diseases. Fig S1. Sample derivation. A description of sample derivation. Fig S2. A depiction of RCG levels measured at different times over a day. Median, 25<sup>th</sup> and 75<sup>th</sup> percentile of random capillary glucose levelsmeasured at different times from 07:00 to <19:00 throughout pregnancy. Fig S3. The distribution of average RCG z-scores throughout pregnancy. Histograms illustrating the distribution of RCG z-scores in general, as well as during each time frame throughout pregnancy. Fig S4. Overlapping and mutually exclusive NDC outcomes. A description of NDC outcomes, accounting for both instances of overlap and non-overlap in the final study sample. Fig S5. The BIC values for each model. A depiction of BIC values for each trajectory model consisting of 1-6 groups and featuring polynomials ranging from 1 to 3. Fig S6. The best-fitting 5-group and the best-fitting 6-group models. A depiction of the best-fitting 5-groupand the best-fitting 6-group models. Fig S7. RCG z-score trajectory groups in the sensitivity analyses. RCG z-score trajectory groups after excluding those with RCG missing in any time intervals, replacing missing values with the smallest, and largest values during each time interval in pregnancy.

Additional file 2. GRoLTS checklist. Guidelines for Reporting on Latent Trajectory Studieswere adhered to bolster our reporting on the Group-Based Trajectory Modeling.

Additional file 3. STROBE checklist. The STROBE checklist showing our study was reported according to the STROBE checklist for cohort studies.

#### Acknowledgements

None.

#### Authors' contributions

S.C. performed data analysis, conducted the literature search, interpreted the findings, and wrote, reviewed, and edited the manuscript. R.G. conceptualized and designed the study and revised the manuscript. R.G., M.P., R.W., H.K., B.L., and C.D. contributed to the data interpretation and revision of the manuscript and approved the final draft. R.G. is the guarantor of this work and, as such, had full access to all the data in the study and takes responsibility for the integrity of the data and the accuracy of the data analysis. All authors read and approved the final manuscript.

#### Funding

Open access funding provided by Karolinska Institute. This work was supported by grants from the Swedish Research Council [grant numbers 2017–02900 (to R.G.), 523–2010–1052 (to C.D.), 2016-06658 and 2022-01404 (to R.W.)], from StratNeuro [Strategic Research Area Neuroscience at the Karolinska Institutet) (to RG.)], from China Scholarship Council [grant numbers 201907930020 (to S.C.)], and from the Knowledge Foundation [KK-stiftelsen, grant numbers 2018-0151, 2021-0002, 2022-0202 (to R.W.)]. The funders had no role in the design and conduct of the study; collection, management, analysis and interpretation of the data; preparation, review, or approval of the manuscript; or decision to submit the manuscript for publication.

#### Availability of data and materials

Data used for the current study were anonymized and obtained from Statistics Sweden and the National Board of Health and Welfare after ethical and legal assessment. Researchers interested in obtaining the data and replicating our results can make inquiry through these data holders. For further information, see https://www. scb.se/en/services/guidance-for-researchers-and-universities/.

#### Declarations

#### Ethics approval and consent to participate

Ethics approval was obtained from the Stockholm regional ethical review committee (DNR 2010/1185–31/5, 2016/987–32). Informed consent was not required for the analysis of anonymized register data.

#### **Consent for publication**

Not applicable.

#### Competing interests

The authors declare that they have no competing interests.

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# Received: 18 January 2023 Accepted: 6 June 2023 Published online: 19 July 2023

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