ARTICLE



Index60 as an additional diagnostic criterion for type 1 diabetes

Maria J. Redondo¹ \bullet · Brandon M. Nathan² · Laura M. Jacobsen³ · Emily Sims⁴ · Laura E. Bocchino^{5,6} · Alberto Pugliese⁷ · Desmond A. Schatz³ · Mark A. Atkinson³ · Jay Skyler⁷ · Jerry Palmer⁸ · Susan Geyer^{5,9} · Jay M. Sosenko⁷ · for the Type 1 diabetes TrialNet Study Group

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Abstract

Aims/hypothesis We aimed to compare characteristics of individuals identified in the peri-diagnostic range by Index60 (composite glucose and C-peptide measure) \geq 2.00, 2 h OGTT glucose \geq 11.1 mmol/l, or both.

Methods We studied autoantibody-positive participants in the Type 1 Diabetes TrialNet Pathway to Prevention study who, at their baseline OGTT, had 2 h blood glucose $\geq 11.1 \text{ mmol/l}$ and/or Index60 ≥ 2.00 (n = 354, median age = 11.2 years, age range = 1.7–46.6; 49% male, 83% non-Hispanic White). Type 1 diabetes-relevant characteristics (e.g., age, C-peptide, autoantibodies, BMI) were compared among three mutually exclusive groups: 2 h glucose $\geq 11.1 \text{ mmol/l}$ and Index60 < 2.00 [Glu(+), n = 76], 2 h glucose < 11.1 mmol/l and Index60 ≥ 2.00 [Glu(+), n = 76], 2 h glucose < 11.1 mmol/l and Index60 ≥ 2.00 [Glu(+), n = 76], 2 h glucose < 11.1 mmol/l and Index60 ≥ 2.00 [Glu(+), n = 165]. **Results** Participants in Glu(+), vs those in Ind(+) or Glu(+)/Ind(+), were older (mean ages = 22.9, 11.8 and 14.7 years, respectively), had higher early (30–0 min) C-peptide response (1.0, 0.50 and 0.43 nmol/l), higher AUC C-peptide (2.33, 1.13 and 1.10 nmol/l), higher percentage of overweight/obesity (58%, 16% and 30%) (all comparisons, p < 0.0001), and a lower percentage of multiple autoantibody positivity (72%, 92% and 93%) (p < 0.001). OGTT-stimulated C-peptide and glucose patterns of Glu(+) differed appreciably from Ind(+) and Glu(+)/Ind(+). Progression to diabetes occurred in 61% (46/76) of Glu(+) and 63% (71/113) of Ind(+). Even though Index60 ≥ 2.00 was not a Pathway to Prevention diagnostic criterion, Ind(+) had a 4 year cumulative diabetes incidence of 95% (95% CI 86%, 98%).

Conclusions/interpretation Participants in the Ind(+) group had more typical characteristics of type 1 diabetes than participants in the Glu(+) did and were as likely to be diagnosed. However, unlike Glu(+) participants, Ind(+) participants were not identified at the baseline OGTT.

Keywords C-peptide \cdot Diagnosis \cdot Glucose \cdot Heterogeneity \cdot Index60 \cdot Insulin resistance \cdot Prediction \cdot TrialNet \cdot Type 1 diabetes \cdot Type 2 diabetes

Abbreviations

GCRC Glucose and C-peptide response curve

Complete listing of Type 1 Diabetes TrialNet Study Group members is included in the electronic supplementary material (ESM)

Maria J. Redondo redondo@bcm.edu

- ¹ Texas Children's Hospital, Baylor College of Medicine, Houston, TX, USA
- ² Division of Pediatric Endocrinology, University of Minnesota, Minneapolis, MN, USA
- ³ University of Florida Diabetes Institute, Gainesville, FL, USA
- ⁴ Indiana University School of Medicine, Indiana University, Indianapolis, IN, USA

- Glu(+) 2 h glucose ≥ 11.1 mmol/l and Index60 <2.00
- ⁵ University of South Florida, Tampa, FL, USA
- ⁶ Jaeb Center for Health Research, Tampa, FL, USA
- ⁷ Diabetes Research Institute, Miller School of Medicine, University of Miami, Miami, FL, USA
- ⁸ University of Washington, Seattle, WA, USA
- ⁹ Division of Biomedical Statistics and Informatics, Mayo Clinic, Rochester, MN, USA

Research in context

What is already known about this subject?

- In islet autoantibody-positive individuals, glucose criteria alone are currently used to diagnose type 1 diabetes
- Beta cell function deficiency is a key characteristic of type 1 diabetes that is currently not used to diagnose type 1 diabetes
- Because type 2 diabetes is prevalent in the population, some autoantibody-positive individuals could develop type 2 diabetes, but the current diagnostic strategy would classify their diabetes as type 1

What is the key question?

• Do individuals with Index60 values ≥2.00 and 2 h glucose levels <11.1 mmol/l have more typical characteristics of type 1 diabetes and are they as likely to be diagnosed as individuals who have 2 h glucose levels ≥11.1 mmol/l and Index60 values <2.00?

What are the new findings?

- Among islet autoantibody-positive individuals, an Index60 value ≥2.00 identifies more individuals with characteristics typical of type 1 diabetes than glucose criteria alone
- Index60 values ≥2.00 can be used to diagnose metabolic abnormalities characteristic of type 1 diabetes earlier than glucose criteria alone

How might this impact on clinical practice in the foreseeable future?

• Index60 values ≥2.00 can be used in addition to glucose criteria to provide an earlier and more accurate diagnosis of type 1 diabetes among autoantibody-positive individuals

Glu(+)/Ind(+)	2 h glucose ≥ 11.1 mmol/l and	
	Index $60 \ge 2.00$	
IA-2A	Insulinoma-associated	
	antigen-2 autoantibody	
ICA	Islet cell antibodies	
Ind(+)	2 h glucose <11.1 mmol/l and	
	Index60 ≥2.00	
mIAA	Microinsulin autoantibody assay	
РТР	Pathway to Prevention	
ZnT8A	Zinc transporter eight autoantibodies	

Introduction

Standard glucose criteria for both type 1 and type 2 diabetes [1] are generally used to diagnose type 1 diabetes in autoantibody-positive participants in longitudinal research studies. Specifically, among asymptomatic individuals, a 2 h blood glucose \geq 11.1 mmol/l during an OGTT, confirmed in a second test, is the diagnostic criterion most often utilised in prevention trials. However, this standard approach does not assess decreased insulin secretion, a major factor in the development of type 1 diabetes.

Individuals with positive islet autoantibodies who ultimately exceed the glucose criteria mentioned above, either clinically or in research studies, do not necessarily have classic type 1 diabetes, as observed in typically young, thin individuals who have type 1 diabetes-associated genetic factors, develop multiple islet autoantibodies and lose their ability to make insulin relatively quickly [1–6]. These individuals could have developed an atypical form of type 1 diabetes. The heterogeneity of type 1 diabetes is a recognised barrier for the success of clinical trials aimed at halting the development and progression of type 1 diabetes [7]. Moreover, since type 2 diabetes is so prevalent, it is likely that a certain percentage of individuals diagnosed as having type 1 diabetes may actually have type 2 diabetes. This lack of diagnostic clarity could potentially be improved by additional metabolic criteria that also take insulin secretion into account, such as those that include both glucose and C-peptide.

This potential diagnostic application was evident in a study of Index60 [8], a composite measure of fasting C-peptide, 60 min C-peptide and 60 min glucose derived from a proportional hazards model. Index60 was initially developed in autoantibody-positive individuals in the Diabetes Prevention Trial (DPT)-1 trial [8] as an additional metabolic diagnostic criterion to facilitate an earlier diagnosis of type 1 diabetes. The findings showed that Index60 values ≥ 2.00 were highly predictive of type 1 diabetes approximately 6-12 months earlier than standard glucose measures alone were. This corroborated findings of Index60 values ≥2.00 reported in the TrialNet Pathway to Prevention (PTP) cohort. In a separate TrialNet PTP cohort, we assessed the utility of an Index60 threshold ≥ 1.00 as a prediabetic endpoint in autoantibodypositive individuals, and found that Index60 could better identify individuals with typical characteristics of type 1 diabetes than dysglycaemia (of which the 2 h glucose is the main component) [9]. Participants above the 1.00 Index60 threshold were appreciably younger and had greater frequencies of islet autoantibodies than those who had dysglycaemia. Not surprisingly, individuals above the 1.00 threshold also had markedly lower C-peptide levels.

Here, we aimed to determine whether Index60, as a diagnostic endpoint, could identify individuals with typical characteristics of type 1 diabetes, who would not have been detected during early stages of disease progression by glucose criteria alone. Demographic, immunological, genetic and metabolic characteristics were analysed among 354 non-diabetic, autoantibody-positive participants from the TrialNet PTP study [10, 11] who exceeded 2 h glucose values >11.1 mmol/l and/or Index60 >2.00 thresholds at their baseline OGTT. Individuals included in this analysis were mutually exclusive of those in the prior study pertaining to diagnosis [8], since all included in that study had baseline 2 h glucose values <11.1 mmol/l and Index60 values <2.00. Using this unique cohort, we performed the first systematic study to assess the use of a composite measure of glucose and C-peptide, such as Index60, for diagnosing individuals with typical type 1 diabetes earlier on in the pathologic process.

Methods

Participants Type 1 diabetes TrialNet, established in 2000, is an NIH-funded, international network of centres that aims to prevent type 1 diabetes and stop disease progression [10]. The TrialNet PTP is an observational study that prospectively follows non-diabetic, islet autoantibody-positive individuals

(first or second-degree relatives of patients with type 1 diabetes) for the progression of islet autoimmunity and the development of clinical type 1 diabetes [11]. Out of 4041 TrialNet PTP participants enrolled between March 2004 and September 2018, we included those who, at their first (baseline) OGTT, had a 2 h blood glucose \geq 11.1 mmol/l (ADA standard threshold for diabetes diagnosis if confirmed by a second test in asymptomatic individuals; see 'Procedures' below) and/or Index60 \geq 2.00 (threshold selected based on previous studies) [8, 9].

We excluded participants who had missing critical variables such as age, OGTT-stimulated C-peptide or glucose values, and islet autoantibodies or a HLA genotype. The final sample size was 354 participants, which were divided into in three mutually exclusive groups: 2 h glucose ≥ 11.1 mmol/l and Index60 <2.00 [Glu(+), n = 76], 2 h glucose <11.1 mmol/l and Index60 ≥ 2.00 [Ind(+), n = 113], or both 2 h glucose ≥ 11.1 mmol/l and Index60 ≥ 2.00 [Glu(+)/Ind(+), n = 165].

All study participants provided informed consent prior to screening and enrolment, and the study was approved by the responsible ethics committee at each site.

Procedures All participants were screened for islet autoantibodies to GAD (GAD65A), insulin (microinsulin autoantibody assay [mIAA]) and insulinoma-associated antigen-2 (IA-2A). If any of these were positive at screening, autoantibodies to zinc transporter 8 (ZnT8A) and islet cell antibodies (ICA) were also tested. Once identified as being autoantibody positive, subsequent evaluations of autoantibodies for participants would include testing for all five type 1 diabetes-associated autoantibodies. Participants were monitored with autoantibody testing, HbA_{1c} and OGTTs at 6- or 12-month intervals depending on estimated risk [11]. Islet autoantibody [12] and C-peptide [13] assays have been previously

Definitions

Early C-peptide 30 - 0 min C-peptide during OGTT

Index60 0.3695[log_e fasting C-peptide in ng/ml] + 0.0165[60 min glucose in mg/dl] -0.3644[60 min C-peptide in ng/ml]

Overweight ≥85th percentile and <95th percentile (age- and sex-adjusted from 2000 CDC growth charts)

Obese ≥95th percentile (age- and sex-adjusted from 2000 CDC growth charts)

Groups by diagnostic range OGTT at baseline (not yet diagnosed):

- 2 h glucose ≥11.1 mmol/l and Index60 <2.00 [Glu(+)], or
- 2 h glucose <11.1 mmol/l and Index60 ≥2.00 [Ind(+)], or
- 2 h glucose ≥11.1 mmol/l and Index60 ≥2.00 [Glu(+)/Ind(+)]

Diagnostic OGTT Within 1 month prior to or at the diagnosis of type 1 diabetes according to standard criteria

described. HLA genotyping was performed at the Type 1 Diabetes Genetics Consortium Laboratories.

The interval of follow-up for the TrialNet PTP cohort per the study protocol is determined by the probability of being diagnosed with type 1 diabetes. OGTTs are conducted at 6-month intervals on participants with at least one of the following: ≥ 2 positive autoantibodies, HbA_{1c} \geq 42 mmol/mol, DPT-1 risk score ≥ 6.50 , fasting glucose ≥ 6.1 mmol/l mg/dl, 30-, 60- or 90-min glucose \geq 11.1 mmol/l, or 2 h glucose \geq 7.8 mmol/l. Autoantibody-positive participants who do not meet any of those criteria are followed at 12-month intervals. According to the TrialNet PTP protocol, participants with a 2 h glucose ≥11.1 mmol/l during their baseline OGTT who did not have supporting clinical criteria were to have a second ('confirmatory') OGTT to establish or rule out type 1 diabetes. Participants not meeting diagnostic criteria on the confirmatory OGTT were followed with semi-annual OGTTs. Therefore, as illustrated in the flow diagram in Fig. 1, there was a temporal discordance. Glu(+) and Glu(+)/Ind(+) had confirmatory OGTTs whereas Ind(+) did not, since the latter group had not exceeded a glucose threshold that would have triggered a confirmatory OGTT in the autoantibody-positive TrialNet PTP participants.

Statistical analyses Characteristics were summarised across the overall cohort as well as by group [i.e., Glu(+), Ind(+) and Glu(+)/Ind(+)] using descriptive statistics. Continuous measures were compared across all groups using Kruskal–

Wallis tests and Wilcoxon rank sum tests for pairwise comparisons between any two groups of interest. χ^2 tests were used to evaluate differential distributions of characteristics, and factors across all three groups or between any two groups. Metabolic measures were similarly evaluated and compared between groups; differences in these measures were further assessed using graphical analyses. Generalised linear regression models were applied to further analyse differences in markers between groups, adjusting for known confounders such as age and BMI percentile. For Ind(+) participants, follow-up data from baseline were used to assess the time to type 1 diabetes diagnosis with Kaplan–Meier methodology. All analyses were performed using the statistical program R (version 3.5.1 for Windows; https://www.R-project.org/). Statistical significance was noted if two-sided *p* values were <0.05.

Results

Overall, 354 participants were identified from the TrialNet PTP study who met the inclusion criteria based on their exceeding 2 h glucose and/or Index60 thresholds during the baseline OGTT. The median age at the baseline OGTT for the entire cohort was 11.2 years (range: 1.7–46.6); 49% were male, 32% were obese or overweight, 83% were non-Hispanic White, and all were relatives (first degree: 90%) of individuals with type 1 diabetes. Participants were classified

Fig. 1 Flow diagram for TrialNet PTP participants who had diabetic range OGTTs at baseline. Out of 4041 TrialNet PTP participants enrolled between March 2004 and September 2018, we included those who, at their first (baseline) OGTT, had a 2 h blood glucose ≥ 11.1 mmol/l and/or Index60 \geq 2.00. We excluded participants who had missing critical variables such as age, OGTT-stimulated C-peptide or glucose values, and islet autoantibodies or a HLA genotype. The final sample size was 354 participants, which were divided into in three mutually exclusive groups: 2 h glucose ≥11.1 mmol/l and Index60 <2.00 [Glu(+), n=76], 2 h glucose <11.1 mmol/l and Index60 \geq 2.00 [Ind(+), *n*=113], or both 2 h glucose ≥ 11.1 mmol/l and $Index60 \ge 2.00 [Glu(+)/Ind(+),$ n=165]. Confirmatory OGTTs were performed in the Glu(+) and Glu(+)/Ind(+) groups (which had a 2 h glucose \geq 11.1 mmol/l at baseline) but not in the Ind(+) group



into one of three mutually exclusive groups: Glu(+), Ind(+) or Glu(+)/Ind(+). Each section below examines differences in characteristic type 1 diabetes markers among the groups (Table 1).

Demographic/clinical Glu(+) participants were much older at the baseline OGTT than Ind(+) and Glu(+)/Ind(+) participants were (p < 0.0001 for both comparisons). Ind(+) participants had a lower mean age than Glu(+)/Ind(+) participants did (p = 0.029). The prevalence of obesity or overweight in the Glu(+) group was higher than in the Ind(+) and Glu(+)/Ind(+) groups (p < 0.0001 for both comparisons). Participants in the Ind(+) group had a significantly lower prevalence of obesity/overweight than participants in the Glu(+)/Ind(+) group did (p = 0.006).

Islet autoantibodies/HLA The Glu(+) group had a lower percentage of multiple (i.e., ≥ 2) autoantibodies than either the Ind(+) or Glu(+)/Ind(+) groups did (p = 0.0006 and p < 0.0001, respectively). The frequency of mIAA positivity was lower in the Glu(+) group than in either the Ind(+) (p = 0.003) or Glu(+)/Ind(+) groups (p = 0.014). The Glu(+) group also had less ICA positivity than the Ind(+) group (p = 0.025) and less IA-2A positivity than the Glu(+)/Ind(+) group (p = 0.015). We did not observe statistically significant differences in the proportions of participants carrying type 1 diabetes-associated HLA haplotypes or genotypes among the groups (Table 1).

C-peptide measures The Glu(+) group had higher values of AUC C-peptide (p < 0.0001), fasting C-peptide (p < 0.0001)

Table 1Comparisons betweengroups at baseline

and early C-peptide response (30–0 min; p < 0.0001) than the Ind(+) or Glu(+)/Ind(+) groups did. The differences all remained statistically significant after adjusting for age and BMI (all p < 0.0001). The Ind(+) group had lower fasting C-peptide levels (p < 0.0001) and greater 30–0 min C-peptide responses than the Glu(+)/Ind(+) group did (p = 0.048).

Figure 2 shows the consistent differences in baseline characteristics between the Glu(+) group and other groups. The Glu(+) group was a clear outlier among the three groups. After the exclusion of participants who had a non-first degree relative with type 1 diabetes, the differences were similar.

OGTT patterns We compared the shapes and positions of combined glucose and C-peptide response curves (GCRCs) from mean glucose and mean C-peptide values at 30, 60, 90 and 120 min of the baseline OGTTs among the three groups. A 2-dimensional grid with glucose on the y-axis and Cpeptide on the x-axis was used to display the shapes and relative positions (Fig. 3). Visual comparisons of the groups' GCRCs revealed that the Glu(+) group had a substantially higher C-peptide response than the other two groups did; this was consistent with a significantly higher mean AUC Cpeptide compared with the other two groups (Table 1). The Glu(+)/Ind(+) group had the most pathological OGTTs as evident from both the GCRC shape, almost monotonic indicating imminent onset, and its position on the grid, with markedly greater AUC glucose values (mean: 13.26 mmol/l; SD: 2.16) than in the Glu(+) (mean: 10.82 mmol/l: SD: 1.22; p < 0.0001) and Ind(+) (mean: 9.99 mmol/l; SD: 0.83; p < 0.0001) groups. Interestingly, despite the difference in

	Glu(+) N = 76	Ind(+) N = 113	Glu(+)/Ind(+) N = 165
Age (years)	22.9±13.9	11.8±11.0***	14.7±10.7***
Overweight or obese: n (%)	44 (58)	18 (16)	50 (30)
Missing	0	2	1
\geq 2 Positive islet autoantibodies: <i>n</i> (%)	55 (72)	104 (92)**	153 (93)***
mIAA positive: <i>n</i> (%)	22 (29)	59 (52)**	77 (47)*
GADA positive: <i>n</i> (%)	64 (84)	95 (84)	140 (85)
IA-2A positive: <i>n</i> (%)	43 (57)	73 (65)	121 (73)*
ICA positive: <i>n</i> (%)	44 (59)	83 (76)*	112 (69)
Missing	2	4	2
ZnT8A positive: n (%)	30 (54)	54 (65)	70 (59)
Not tested/missing	20	30	46
HLA DR3-DQ2/DR4-DQ8: n (%)	13 (17)	31 (27)	41 (25)
Fasting C-peptide (nmol/l)	0.80 ± 0.43	$0.33 \pm 0.17^{***}$	$0.50 \pm 0.30^{***}$
Early (30-0 min) C-peptide (nmol/l min)	1.00 ± 0.57	$0.50 \pm 0.23 ***$	$0.43 \pm 0.30^{\ast \ast \ast}$
Mean AUC C-peptide (nmol/l)	2.33 ± 0.90	$1.13 \pm 0.37^{***}$	$1.10 \pm 0.50^{***}$

Values are mean (SD) unless otherwise noted

***p<0.0001; **p<0.01; *p<0.05 in comparison to Glu(+)

Fig. 2 Comparisons of characteristics among the three groups at baseline for age (**a**), mean AUC C-peptide (**b**), autoantibody positivity (**c**) and BMI percentile (**d**). Both Ind(+) and Glu(+)/Ind(+) were significantly different (***p<0.001; **p<0.01; *p<0.05) from Glu(+) for all comparisons. Significant differences were present between Ind(+) and Glu(+)/Ind(+) for age (**a**) ([†]p<0.05) and for BMI percentile (^{††}p<0.01)



glucose values, the Ind(+) and Glu(+)/Ind(+) groups had comparable C-peptide levels (Table 1).

Figure 3 illustrates the GCRCs at baseline and at diagnosis (among those who were diagnosed by OGTT at least 3 months after baseline). It shows the evolution of shape and position of the GCRCs from baseline (dashed lines) to diagnosis (solid lines) among those with diagnostic OGTTs. Although the shape near diagnosis in the Ind(+) group was much like that in the Glu(+)/Ind(+) group, the Glu(+) group continued to

differ substantially from the other two groups, with much higher C-peptide levels. Also, the change from baseline to diagnosis was minimal in the Glu(+)/Ind(+) group, suggesting that diabetes was already present but not diagnosed in a number of those individuals.

Progression to type 1 diabetes The median follow-up time from baseline to the diagnosis of type 1 diabetes or end of follow-up (i.e., last OGTT) of the 354 who were studied was



Fig. 3 Differing OGTT patterns (30 to 120 min) at baseline (dashed lines) and at diagnosis of type 1 diabetes (solid lines). At baseline, C-peptide was higher at 30 min and had a more pronounced increase during the baseline OGTT in Glu(+) than the other two groups. At diagnosis, note the similarity between Ind(+) and Glu(+)/Ind(+), and the continuing

difference between Glu(+) and the other groups. Also, note that Glu(+)/Ind(+) was essentially unchanged from baseline to the diagnosis of diabetes. Mean values of C-peptide and glucose values are shown. Glu(+)/Ind(+): n=58, Ind(+): n=39, Glu(+): n=34. The empty circle at the beginning of each curve represents the values at 30 min in the OGTT

3.6 years overall (2.0, 4.45 and 2.5 years for Glu(+), Ind(+) and Glu(+)/Ind(+), respectively). The percentage ultimately diagnosed during follow-up was 61% (46/76) for Glu(+), 63% (71/113) for Ind(+), and 88% (146/165) for Glu(+)/Ind(+). Ind(+) had a cumulative incidence of 95% (95% CI 86%, 98%) at 4 years. The Ind(+) cumulative incidence curves from the other two groups in which confirmatory OGTTs were performed, since those with Index60 ≥2.00 and a 2 h glucose <11.1 mmol/l would not have been recognised according to the protocol for the PTP.

Discussion

In this study of autoantibody-positive individuals, we compared three mutually exclusive groups exceeding glucose and/or Index60 diagnostic thresholds for characteristics associated with type 1 diabetes. In those comparisons, we observed that participants in the Ind(+) and Glu(+)/Ind(+) groups had similar characteristics, which differed substantially from those in Glu(+) participants and were more typical of classic type 1 diabetes (i.e., younger, less overweight/obesity, lower C-peptide measures, higher percentages of ≥ 2 islet autoantibodies). GCRCs of Glu(+) participants also differed markedly from those of the other groups at baseline and continued to differ at diagnosis. Even though participants in the Ind(+) group did not have the same diagnostic surveillance as participants in the Glu(+) group, the percentages of those ultimately diagnosed were equivalent between the two groups.

During the progression from autoantibody positivity to clinical type 1 diabetes, the early C-peptide response typically decreases, which is accompanied by increasing glucose levels [14–16]. The early C-peptide response was higher in the Glu(+) group than in the other two groups, yet despite this seemingly greater C-peptide response, 2 h glucose levels were in the diabetic range. This suggests the presence of diabetogenic factors other than the autoimmune destruction of beta cells. Such factors could include insulin resistance [17, 18], adiposity, and/or other abnormalities determined by type 2 diabetes-associated genetic loci [19]. We previously demonstrated that among autoantibody-positive individuals, type 2 diabetes-associated factors, including genetic variants [20–23] and obesity [24, 25], can influence the progression to diabetes. Autoantibody-positive relatives carrying the type 2 diabetesassociated TCF7L2 genetic variant had lower glucose and higher C-peptide at the time of progression to diabetes [20].

It is noteworthy that when GCRCs in the Ind(+) group evolved from the baseline OGTT to the diagnostic OGTT, they had a shape (almost monotonic) and position on the 2-D grid similar to the Glu(+)/Ind(+) group, which changed minimally (Fig. 3). This observation suggests that, at the baseline OGTT, participants in the Glu(+)/Ind(+) group had more advanced progression to type 1 diabetes than participants in the Ind(+) group did. It is possible that most Glu(+)/Ind(+)participants who had confirmatory OGTTs could already have reached the onset of disease, which would have been unrecognised without Index60 as a criterion. Thus, it appears that the two groups shared the same pathway towards type 1 diabetes on the 2D grid: GCRCs in the Ind(+) group resembled those in the Glu(+)/Ind(+) group when there was further decompensation and glucose levels increased substantially. In contrast, GCRCs in the Glu(+) group differed markedly from the other two groups at baseline and diagnosis, which suggests that the differences between the Glu(+) group and the other groups were not a function of disease progression but rather pathogenesis. The differing GCRCs in the Glu(+) group are consistent with the atypical associations with markers of type 1 diabetes in that group (e.g., age, adiposity, autoantibody positivity).

A limitation of this study was the use of HLA DR3-DQ2 and DR4-DQ8 alone to evaluate genetic differences. Although we observed a greater frequency of these high-risk haplotypes in the Ind(+) and Glu(+)/Ind(+) groups than in the Glu(+)group, the differences did not reach statistical significance. Type 1 diabetes genetic risk scores could have been helpful in showing differences, since they have demonstrated superiority over HLA alone to predict type 1 diabetes in at-risk individuals [26]. However, the number of participants characterised with a genetic risk score was insufficient for analysis. Individual alleles at other loci have smaller effects on risk and therefore would be unlikely to show significant associations in our analysis. Another limitation was the inability to assess insulin resistance, since measures such as HOMA-IR have not been validated in individuals with severe insulin deficiency, as well as in other populations. Bias must always be considered in observational studies. In our study, bias could have been introduced by the temporal discordance resulting from the lack of confirmatory testing of Index60 values ≥2.00. However, such bias would likely have served against Index60, since Ind(+) had less diagnostic surveillance.

The contrasts between the Glu(+) and Ind(+) groups are revealing and suggest a need to reassess the current diagnostic criteria for type 1 diabetes. Glu(+), atypical for characteristics of type 1 diabetes, represented 32% (76/241) of those with a 2 h glucose \geq 11.1 mmol/l at the baseline OGTT. If Ind(+) had also been included as a diagnostic criterion for the baseline OGTTs in the PTP, an additional 47% (354/241) of participants would have warranted confirmatory testing for diagnosis. Those additional Ind(+) individuals would have been more typical for type 1 diabetes with as much likelihood for acquiring the disorder as Glu(+) individuals were. Thus, it appears that Ind(+), or a comparable glucose and C-peptide composite measure, would be as justified as a diagnostic criterion for type 1 diabetes as Glu(+). The addition of Ind(+) as a diagnostic criterion would provide several benefits. The greater typicality of Ind(+) could enhance the performance of potential immunomodulatory therapies. For example, as a diagnostic criterion, Ind(+) would provide a younger study population, which in itself is a predictor of response to most immunomodulatory therapies in autoantibody-positive relatives [6]. More individuals would be diagnosed earlier, which could enhance studies designed to prevent or delay the decline of insulin secretion. Importantly, an earlier diagnosis could potentially decrease the frequency of diabetic ketoacidosis. Also, the addition of Ind(+) as a diagnostic criterion could provide a potential means for classifying metabolic heterogeneity at diagnosis and help to personalise clinical management.

The findings from this study raise the important question of whether Glu(+) is characteristic of the type 1 diabetes spectrum or whether it represents a different disorder such as type 2 diabetes. We have previously demonstrated that type 2 diabetesassociated mechanisms, such as obesity and genetic factors, can influence progression of islet autoimmunity [21, 27] and development of clinical diabetes [21, 24, 25] in autoantibodypositive individuals. It is plausible that some of those mechanisms are at play in the subset of Glu(+) participants. Other questions also arise. How do individuals in this group relate to latent autoimmune diabetes in adults (LADA) [28]? Should Glu(+) be differentiated from Ind(+) with regard to glucose management? Should Glu(+) be considered separately in designing protocols for preventing further insulin secretory decline after diagnosis? Also, should Index60 be incorporated among the criteria for staging of type 1 diabetes? Regarding the last question, the findings from our prior studies and the current study appear to suggest that a composite glucose/C-peptide measure such as Index60, would enhance the staging of type 1 diabetes. Future studies, including longitudinal observations after the clinical diagnosis, will need to address these questions.

In conclusion, the findings of this study appear to indicate that autoantibody-positive individuals who exceed the 2 h glucose 11.1 mmol/l threshold for diabetes, but not the \geq 2.00 Index60 threshold, have distinct GCRCs from those exceeding Index60 \geq 2.00 with or without a 2 h glucose \geq 11.1 mmol/l. Individuals reaching the \geq 2.00 Index60 threshold with a 2 h glucose still <11.1 mmol/l appear to already be at or near the stage of clinical type 1 diabetes (stage 3) [29], warranting confirmatory testing for type 1 diabetes, but with less beta cell impairment compared with those who also have glucose criteria. These findings provide evidence that diagnostic criteria for type 1 diabetes should include Index60 or a similar composite measure of glucose and C-peptide.

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Data availability TrialNet data can be requested from the NIDDK public repository. The datasets generated and analysed during the current study will be made available by request from the NIDDK Central Repository at https://repository.niddk.nih.gov/studies/trialNet

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All authors are members of the Type 1 diabetes TrialNet Study Group (list of study group members in provided as electronic supplementary material [ESM]). MJR and JS are the guarantors of this article and take full responsibility for the work as a whole, including the study design, access to data and the decision to submit and publish the manuscript.

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