REVIEW



Youth-onset type 2 diabetes: translating epidemiology into clinical trials

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Abstract

Globally, the proportion of new diagnoses of youth-onset diabetes represented by type 2 diabetes is increasing, and youth with type 2 diabetes commonly have complications and comorbidities, as well as a higher rate of mortality. In this review, we summarise what is known about the natural progression of youth-onset type 2 diabetes from published clinical trials and large-scale prospective epidemiological studies. It is important to note that the robust pathophysiological and treatment data specifically related to individuals with a diabetes onset at ≤ 20 years of age largely hails from the USA. Youth-onset type 2 diabetes is characterised by pathophysiological heterogeneity and inadequate glycaemic control, highlighting the need for new treatment approaches and innovative study designs in populations of varied genetic and cultural backgrounds.

Keywords Clinical trials · Epidemiological studies · Review · Study design · Youth-onset type 2 diabetes

Abbreviations

ADOPT	A Diabetes Outcome Progression Trial
DKA	Diabetic ketoacidosis
GLP-1	Glucagon-like peptide-1
MOST	Multiphase optimisation strategy
RISE	Restoring Insulin SEcretion
SEARCH	SEARCH for Diabetes in Youth
SGLT2	Sodium-glucose cotransporter 2
SMART	Sequential multiple-assignment trial
TODAY	Treatment Options for Type 2 Diabetes in
	Adolescents and Youth

Background epidemiology

While there was a time that the term 'juvenile diabetes' was synonymous with type 1 diabetes, the global picture of youthonset diabetes has changed significantly over the past 30 years. Overall, the incidence of paediatric-onset type 1 diabetes is still greater than paediatric type 2 diabetes. However, particularly among adolescents, the proportion of newly diagnosed youth-onset diabetes represented by type 2 diabetes is increasing, with estimated incidence rates ranging from 0.72/100,000 in the UK [1] to 2.56/100,000 in Kuwait [2] and 3.45/100,000 in Canada [3]. Moreover, in many countries, including Qatar [4], the USA [5], the UK [1], Canada [3] and China [6], the incidence is currently rising several percentage points per year. Youth-onset type 2 diabetes is a disease of adolescent onset occurring almost universally in youth who are overweight or obese, most of whom have a strong family history of type 2 diabetes and/or exposure to gestational diabetes in utero [7]. It should be noted that the global prevalence of being overweight and obese in adolescence is high, ranging from 8% to 40%, depending on the country [8], but youth-onset type 2 diabetes is still rare in comparison. The incidence of youth-onset type 2 diabetes also varies widely by genetic and cultural background (e.g., being more common in youth with Hispanic ethnicity and in indigenous populations in the USA and Canada). In the western world, youth-onset type 2 diabetes is almost twice as common in girls as in boys, whereas Asian countries report no differences in incidence by sex [9].

Diagnosis of type 2 diabetes at a young age has a significant impact on risk of mortality: data from Sweden demonstrate that mortality rates are three times higher in young adults with type 2 diabetes compared with the general population after a mean follow-up of 8 years [10]. Data from the

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SEARCH for Diabetes in Youth (SEARCH) study in the USA show similarly elevated mortality rates, 2.4 times higher than in the general population, for youth with type 2 diabetes after an average of only 5 years of follow-up [11]. Both of these studies, as well as data from Australia [12], demonstrate greater risk of mortality for youth with type 2 diabetes than with type 1 diabetes, despite a shorter disease duration. Because youth-onset type 2 diabetes is still a relatively new disease affecting a small proportion of the population, there is still much to be learned about its pathophysiology and effective treatments. The goal of this review is to summarise the lessons from the largest studies and clinical trials of youth-onset type 2 diabetes and to discuss challenges and future directions.

What do we know about treatment effects from current studies?

Clinical trials focusing on paediatric type 2 diabetes are limited. In 2007, Gottschalk et al. published results of a 26 week randomised trial of the sulfonylurea glipizide vs the biguanide metformin in 285 youth with type 2 diabetes [13]. They found a similar short-term reduction in HbA1c in both groups but significantly greater weight gain with glipizide. Other non-industrysponsored clinical trials specific to youth-onset type 2 diabetes include the Treatment Options for Type 2 Diabetes in Adolescents and Youth (TODAY) study [14] and the paediatric arm of the Restoring Insulin SEcretion (RISE) study [15] (both of which were only in the USA and partly designed to study the pathophysiology of type 2 diabetes in youth), and an open-label study of metformin in Japan [16]. The Japanese metformin study did note improvements in HbA1c over 24 weeks without significant adverse effects; however, there was no comparison group in this study. While many industry-sponsored clinical trials are underway, only one study has published results to date. In this study of 135 US youth with type 2 diabetes, aged 10-16 years, the glucagon-like peptide-1 (GLP-1) agonist liraglutide resulted in a treatment difference for HbA1c of 11.6 mmol/mol (95% CI -18.0, -5.0) (-1.06% [95% CI -1.65, -0.46]), but no treatment effect on BMI at the end of the 26 week placebo-controlled phase [17]. However, the dose was titrated up only if fasting glucose was elevated, which limited the number of participants reaching a full 1.8 mg dose, possibly curtailing weight loss effects, and there was a reduction in BMI by -0.18 kg/m^2 (95% CI -0.33, -0.03) after the 52 week open-label extension. The safety and efficacy data from this trial resulted in US Food and Drug Administration approval of liraglutide for treatment of youthonset type 2 diabetes.

TODAY study The TODAY study was a multi-site randomised clinical trial designed with the underlying hypothesis that early, aggressive intervention to improve insulin sensitivity would prolong glycaemic control, defined as persistent HbA_{1c} \geq 64 mmol/mol (\geq 8.0%) or failure to wean from insulin after starting due to metabolic decompensation. This study, which began before sodium-glucose cotransporter 2 (SGLT2) inhibitors or GLP-1 agonists were approved in the USA, compared treatment with metformin vs two add-on therapies (intensive lifestyle intervention and the thiazolidinedione rosiglitazone), with a primary outcome of loss of glycaemic control [18]. Participants (N = 699) were aged 10–17 years at baseline, had been diagnosed with type 2 diabetes <2 years and had BMI equal to or greater than the 85th percentile. The cohort was 64.7% female sex, 39.7% Hispanic, 32.5% non-Hispanic Black, 20.3% non-Hispanic White, 5.9% American Indian and 1.6% Asian. The run-in phase of the trial demonstrated that a large majority (~90%) of youth with recent onset of diabetes can be weaned from insulin and achieve glycaemic control on metformin monotherapy alone, regardless of presenting HbA_{1c} [19, 20]. However, by the end of the trial, almost half (45.6%) of the participants reached the primary outcome, with a mean time to failure of 3.86 years [13]. The TODAY study demonstrated a beneficial add-on effect of rosiglitazone (failure rate 38.6% vs 51.7% with metformin alone), which was most notable in girls. Furthermore, it demonstrated that metformin monotherapy is particularly ineffective in non-Hispanic Black youth, with a 66.2% failure rate. Of note, rosiglitazone has since been withdrawn from the European market and only has very limited availability in the USA; pioglitazone, another thiazolidinedione, is still available. There was a decline in beta cell function over time in the TODAY study, regardless of treatment group, though there was a beneficial effect of rosiglitazone use during the first 6 months [21]. When compared with similar trials in adults, glycaemic control failure rates and decline in beta cell function were more than two times higher in the TODAY study, despite a shorter disease duration in youth [22]. For example, in the A Diabetes Outcome Progression Trial (ADOPT), failure rates in adults taking metformin alone were 12% as compared with 51.7% in participants who took metformin for the same duration in the TODAY study [23].

The incidence of glycaemic failure in the TODAY study plateaued over time, suggesting that there are subgroups of adolescents with type 2 diabetes who rapidly lose glycaemic control and others who can maintain good control over a longer period of time. In the TODAY study, residual beta cell function, not insulin sensitivity, was identified as the primary determinant of glycaemic control. However, of clinical relevance, a baseline (i.e. following run-in during which participants were treated with metformin monotherapy) HbA_{1c} \geq 45.4 mmol/mol (\geq 6.3%) predicted glycaemic failure over the first 48 months [24], suggesting that escalation of treatment may be needed in youth even earlier than current American Diabetes Association targets recommend (HbA_{1c} \geq 53.0 mmol/mol [\geq 7%]). Once participants reached the primary outcome in the TODAY study, metformin was continued,

rosiglitazone (if present) discontinued and insulin initiated. Importantly, there was only a modest improvement in HbA_{1c} (<5.5 mmol/mol [<0.5%]) 6 months after insulin initiation, and no significant improvement in 1 year, such that mean HbA_{1c} was still 85.8 mmol/mol (10.0%) [25], highlighting the difficulty in achieving glycaemic control with only metformin and insulin once beta cell function has declined.

RISE study Given the high rates of beta cell deterioration seen in the TODAY study, the RISE Consortium examined the effect of interventions designed to preserve or improve beta cell function in adults and children with prediabetes (impaired glucose tolerance and fasting glucose $\geq 5.0 \text{ mmol/l}$) or recently diagnosed type 2 diabetes [26]. The RISE paediatric clinical trial compared 3 months of insulin glargine followed by 9 months of metformin vs 12 months of metformin, with a primary outcome of beta cell function, assessed by the goldstandard hyperglycaemic clamp, 12 months after initiation of treatment and again at 15 months, after 3 months of washout. Participants (aged 10-19 years) had prediabetes (60%) or type 2 diabetes diagnosed within the last 6 months (40%). By 12 months, beta cell function declined significantly compared with baseline in both groups, without any significant treatment differences [15]. Transient reductions in HbA_{1c} were observed in both groups, though HbA_{1c} increased back to baseline by 12 months. There was no effect of treatment on fasting or 2 h OGTT glucose at 12 or 15 months. Thus, the RISE study extended the findings of the TODAY study to show that insulin and metformin were ineffective in preventing beta cell deterioration in youth with prediabetes or type 2 diabetes, even when initiated early in the disease course.

The RISE study protocols were the first to allow for direct phenotypic comparison of adults and youth with prediabetes or type 2 diabetes. At baseline, clamp-based insulin sensitivity was 46% lower in youth than in adults, and youth had higher acute, steady-state and maximal C-peptide and insulin responses. Despite initially robust beta cell response, youth showed beta cell decline during first 12 months, whereas adults treated with metformin or insulin showed improvement in beta cell response and HbA_{1c}, as well as weight loss, during that time period. Taken together, the RISE study demonstrates a different phenotype in youth vs adults at type 2 diabetes onset, with greater insulin resistance and higher beta cell response; further, youth did not experience improvements with the only two US Food and Drug Administrationapproved treatments at the time of the study.

SEARCH study SEARCH is a large epidemiological study designed to describe the incidence and prevalence of diabetes in the USA. It also includes longitudinal cohorts to better characterise youth with type 1 and type 2 diabetes. Thus, results from the SEARCH study are more representative of real-world experience with youth-onset type 2 diabetes. In line

with the TODAY study, baseline cross-sectional analysis in the SEARCH study (2002-2005) revealed that more than 50% of youth with a type 2 diabetes duration of at least 2 years had poor glycaemic control (HbA1c > 63.9 mmol/mol [>8%]) [27]. Most participants were treated with lifestyle intervention, metformin, insulin or a combination of these. After a mean of 7 years of follow-up, a significant proportion of participants changed their treatment regimen, adding or taking away metformin and/or insulin. A few took alternative glucoselowering drugs, primarily thiazolidinediones or sulfonylureas, and only 35% were meeting glycaemic targets (HbA_{1c} < 53.0 mmol/mol [<7%]) [28]. It is important to note that this follow-up time period occurred prior to publication of the TODAY study results. However, registry data from the US Pediatric Diabetes Consortium suggest that very few youth were treated with agents other than insulin and metformin in

Major trials/studies of treatment for youth with type 2 diabetes

TODAY [14]

- N=699 participants, 10–17 years of age, with type 2 diabetes duration <2 years and BMI ≥85th percentile.
- Participants were randomised to metformin alone, metformin+rosiglitazone or metformin+lifestyle modification, over a study period of 2–6 years.
- In total, 45.6% reached the primary outcome of prolonged loss of glycaemic control. Once participants reached the primary outcome, metformin was continued, rosiglitazone (if present) discontinued and insulin initiated. Metformin+insulin was ineffective in preventing beta cell deterioration.

RISE [15]

- N=91 participants, 10–19 years of age, with prediabetes or new-onset type 2 diabetes.
- Participants were randomised to insulin glargine for 3 months followed by metformin for 9 months or metformin for 12 months and followed over 15 months.
- Metformin±insulin was ineffective in preventing beta cell deterioration.

SEARCH [27]

- N=474 participants, 10–20 years of age.
- Participants were randomised to lifestyle modification, metformin, insulin, or a combination of these (study ongoing).
- After 7 years of follow-up, only 35% met glycaemic targets (HbA_{1c} <53.0 mmol/mol [<7%]).

paediatric specialty centres in the years following the TODAY study, despite inadequate glycaemic control in >54% and failure of the TODAY study to show improvement in blood glucose levels after adding insulin. Together, the results of these studies demonstrate that new approaches and therapies are required for youth-onset type 2 diabetes, potentially including bariatric surgery, which appears to be more effective than the treatments used in the TODAY study [29].

Comorbidities and complications

Most of what is known about the prospective evolution of comorbidities and complications in youth-onset type 2 diabetes comes from the TODAY (and its observational extensions) and SEARCH studies. Both studies demonstrate that comorbidities and complications are common, even within 2 years of diagnosis. Data from the SEARCH study estimate that 72% of youth with type 2 diabetes experience at least one comorbidity or complication by early adulthood [30].

Microvascular complications Microvascular complications, including diabetic kidney disease, retinopathy and neuropathy, have been described during adolescence in both the TODAY and SEARCH studies. These studies suggest a frequency of elevated albumin excretion in youth with recently diagnosed type 2 diabetes of 6.3–7.8%, increasing to 18.2–16.6% in early adulthood [31, 32]. Hyperfiltration, an early marker of risk for chronic kidney disease, increased in the TODAY study participants from 7% at baseline to 13.3% by 5 years [33]. In the TODAY and SEARCH studies, retinopathy was assessed using retinal photography and was found to be prevalent in 13.7% and 9.1%, respectively [30, 34]. In the TODAY study, retinopathy was associated with older age, longer duration of diabetes and poorer glycaemic control [34]. Early-onset retinopathy and nephropathy have also been described in Pima Indians, particularly compared with those with adult-onset type 2 diabetes [35]. Finally, peripheral neuropathy, as assessed by the Michigan Neuropathy Screening Inventory Examination, was present in 17.7% of SEARCH study participants [29]. Furthermore, data from the SEARCH study [30] and others [12, 36–40] show that these three microvascular complications are more common in youth with type 2 diabetes than in those with type 1 diabetes, despite a shorter disease duration on average in those with type 2 diabetes, even after adjusting for obesity, blood pressure and glycaemic control. It is important to note that these complication data were collected during the initial treatment phase of the TODAY study, whereas, in the SEARCH study, they were collected during the follow-up portion of the study, by which time participants were all late adolescents or young adults. Early-onset microvascular complications have also been described in population-based studies in relation to youth-onset diabetes in Manitoba (Canada) and India [41] and in young-onset diabetes in China [37] and Australia [42]. More information is needed on the early evolution of these complications as they relate to diabetes treatment in youth-onset type 2 diabetes in other cultural and genetic backgrounds.

Cardiovascular complications Early cardiovascular disease risk markers also appear to be prevalent early in the disease course of paediatric type 2 diabetes, including hypertension, dyslipidaemia, vascular and cardiac dysfunction and cardiac structural abnormalities. At baseline, more than 25% of youth with type 2 diabetes had blood pressure above the 90th percentile in the TODAY [43] and SEARCH [44] studies. In addition, in the TODAY study, 11.6% of participants were hypertensive (blood pressure \geq 130/80 or \geq 95th percentile) at baseline, increasing to 33.8% after a mean of 3.9 years of follow-up [31]; male sex and higher BMI increased the risk of hypertension. Other cardiovascular disease risk markers were also common in youth-onset type 2 diabetes in the TODAY and SEARCH studies. Low HDL-cholesterol was most common, affecting 44-80% of youth, whereas 10-42% had elevated triacylglycerols and 5-14% had elevated LDL-cholesterol [43, 45]. During follow-up in the TODAY study, the prevalence of elevated LDL-cholesterol more than doubled over time (between baseline and end of study) [46]. In the TODAY study, echocardiograms were performed during the last year of the randomised trial, at a median of 4.5 years after diagnosis, and again several years later during observational follow-up. Initial findings included high/normal mean left ventricular mass and adverse left ventricular geometry in 16.2% [47]; higher left ventricular mass was positively associated with male sex, non-Hispanic Black race/ethnicity, BMI, systolic blood pressure, antihypertensive medications, blood glucose levels and smoking, and was inversely related to heart rate. The followup echocardiograms demonstrated reduced ejection fraction (<52%) in 11.7% of male TODAY study participants and a higher frequency of cardiac structural abnormalities, such as left ventricular hypertrophy, was seen in the TODAY participants (15.8%) as compared with age, race/ethnicity and sexmatched control individuals with similar BMI (5.7%) and participants with normal weight (0%) [48]. At a mean type 2 diabetes duration of 7.6 ± 1.5 years, arterial stiffness was identified in up to 50% of TODAY study participants, correlating with older age, race/ethnicity, female sex, higher HbA1c, blood pressure and BMI [49]. Moreover, 7 years after randomisation, the TODAY study participants showed, on average, reduced heart rate variability with parasympathetic loss and sympathetic overdrive vs control participants; cardiac autonomic dysfunction was present in 8% of the TODAY participants and correlated with higher HbA_{1c} [50]. The SEARCH study additionally described a high prevalence of cardiovascular autonomic neuropathy (15.7%) and arterial stiffness (47.4%), after a mean diabetes duration of 7.9 years; arterial stiffness was more common than in youth with type 1 diabetes (11.6%, p <



Fig. 1 Schematic of a possible SMART design trial for youth-onset type 2 diabetes. The figure shows an example of a SMART design for a trial enrolling adolescents with type 2 diabetes treated with metformin \pm insulin, positive for depressive or diabetes distress symptoms, and HbA_{1c}> 47.5 mmol/mol (>6.5%). Interpersonal therapy (IPT) is effective for treatment of depression [62] and is particularly suitable for individuals from historically disadvantaged racial/ethnic groups [63]. Add-on

0.001) [30]. Thus, cardiovascular disease risk is prevalent early in the course of youth-onset type 2 diabetes and appears to be worse than in peers with type 1 diabetes and peers with obesity but without diabetes. This is particularly foreboding in terms of early-onset cardiovascular events and the potential impact on healthcare costs and quality of life. Since these and other complications are directly related to glycaemic control and insulin resistance, it is critical to develop more effective treatments for diabetes and obesity in these youth.

Psychosocial comorbidities Psychosocial comorbidities were also relatively common in the TODAY study, including binge eating behaviours (26%), clinically significant depressive symptoms (14.8%) and exposure to stressful life events (67%) [51, 52]. Furthermore, while little is known about diabetes distress (negative feelings that are specifically related to having and treating diabetes) in youth-onset type 2 diabetes, diabetes distress is known to be common in youth with type 1 diabetes [53] and in adults with type 2 diabetes [54]. These psychosocial comorbidities may substantially contribute to challenges in maintaining glycaemic control in youth-onset type 2 diabetes.

Future directions and clinical trial opportunities

Current data demonstrate that the therapies most widely used for treatment of youth-onset type 2 diabetes are inadequate for maintaining glycaemic control and preventing diabetes

pharmacological therapy (Add pharmaRx) involves the addition of a newer diabetes treatment agent (e.g., GLP-1 agonist, SGLT2 inhibitor), individualised based on patient characteristics. Mindfulness-based therapy (MBT) has been shown to decrease depression and may particularly target stress-related behaviours that undermine adherence and worsen outcomes in youth-onset type 2 diabetes [64, 65]. This figure is available as a downloadable slide

complications. Newer agents, such as SGLT2 inhibitors and GLP-1 agonists, have been shown to be clinically effective and safe, and to have additional benefits of providing modest weight loss and cardiorenal protection in adults; however, there are many barriers to completing trials of these agents in youth [22]. Furthermore, the fact that glycaemic control did not improve even after initiation of insulin in the TODAY study suggests that barriers to treatment and adherence also play a significant role in youth-onset diabetes. Future trials should also examine the effect of treating psychological comorbidities in youth with type 2 diabetes, who almost universally have undertreated psychosocial barriers to treatment [55], which can lead to non-adherence [51]. In the TODAY study, 14.8% of participants reported clinically significant depressive symptoms at baseline, although a recent review suggests that the prevalence of elevated depressive symptoms in youth-onset type 2 diabetes may be closer to 20% [56]. TODAY study participants with lower medication adherence were more likely to have clinically significant depression at baseline [57]; however, depressive symptoms were not related to glycaemic control [58]. Similarly, in SEARCH study participants with type 2 diabetes, baseline depression and changes in depressive symptoms were not associated with HbA_{1c}; however, decreases in diabetesspecific quality of life predicted higher HbA_{1c}, suggesting that youth with type 2 diabetes need effective coping and problemsolving skills [59]. Depression and diabetes distress may have effects on blood glucose through factors such as disordered eating and poor sleep behaviours, or through interactions with

stress physiology, and these relationships may be bidirectional [56].

Treatment of youth-onset type 2 diabetes likely requires multicomponent, biobehavioural interventions, as well as the more recently available treatments for type 2 diabetes, which have been shown to be safe and effective in adults. Future trials need to individualise treatment randomisation, considering medical, demographic and psychosocial factors, in order to maximise potential benefit. For example, an individual with needle phobia may do better on a daily SGLT2 inhibitor than a weekly injectable GLP-1 agonist. On the other hand, a patient who struggles to have daily insulin injections and, thus, who is at greater risk for diabetic ketoacidosis (DKA) and less likely to monitor ketones, is probably not a good candidate for an SGLT2 inhibitor, given the potential adverse effect of euglycaemic DKA with these agents. Furthermore, there is evidence that race, ethnicity and genetic background influence response to treatment, but little is known about these factors in youth, particularly given the lack of clinical trials in youthonset type 2 diabetes outside the USA. Finally, in addition to the impact of depression on diabetes care behaviours, there is also evidence that mood disorders may exacerbate insulin resistance and, thus, response to treatment [56]. Therefore, depressed mood needs to be addressed as a component of the treatment. Importantly, as was nicely outlined in the consensus statement by Nadeau et al. [22], the numbers of youth affected by type 2 diabetes are too limited to study each agent individually, as was done in adults with type 2 diabetes to obtain the clinical treatment indication for newer glucoselowering agents.

For these reasons, the multiphase optimisation strategy (MOST) [60] and sequential multiple-assignment trials (SMARTs) [61] may be useful in developing and testing new treatment approaches. MOST is a framework for optimising and evaluating multicomponent, biobehavioural interventions, while a SMART is a trial aimed at building personalised, adaptive interventions that identify tailoring variables indicating the need for treatment intensification or modification. SMART designs are particularly useful in settings with pathophysiological heterogeneity, as is the case in youth-onset type 2 diabetes, allowing treatment decisions to be individualised. The factorial or fractional factorial design used in SMARTs is efficient, ideal for relatively uncommon diseases, can be used to evaluate interactions between treatments, and asks participants to implement fewer intervention components at the same time, thus improving adherence and retention. Particularly relevant to youthonset type 2 diabetes, SMART designs are ideal when there is a need to balance efficacy with treatment burden, when adherence is challenging, and if comorbidities need to be considered in treatment algorithms. Figure 1 provides an example of a potential SMART design.

In summary, youth-onset diabetes is associated with inadequate glycaemic control and early-onset of complications in most individuals, resulting in early morbidity and mortality. Classic randomised trial designs, which fail to address the heterogeneity and psychosocial components of this disease, are unlikely to be effective. Thus, innovative clinical trials are needed to improve the treatment of youth-onset diabetes.

Supplementary Information The online version contains a slide of the figure for download available at https://doi.org/10.1007/s00125-021-05480-w.

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