Jose C. Florez *Editor*

The Genetics of Type 2 Diabetes and Related Traits



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Biology, Physiology and Translation



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ISBN 978-3-319-01573-6 ISBN 978-3-319-01574-3 (eBook) DOI 10.1007/978-3-319-01574-3

Library of Congress Control Number: 2015958349

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Preface

When Victor Neel termed type 2 diabetes (T2D) "the geneticist's nightmare," (Neel 1962) it was already evident that T2D harbored a familial component; yet its polygenic genetic architecture, the inherent limitations in the techniques available at the time, and the strong (and growing!) influence of environmental determinants made genetic discovery an arduous task. In the 50 years since then, the public health impact of T2D has only skyrocketed, fueled by the changes in modern lifestyle increasingly adopted by developing societies and the expansion of caloric superabundance.

As a result, T2D and its complications represent one of the most serious challenges to public health in the twenty-first century. We live in the midst of a worldwide pandemic that threatens to undermine the significant gains we have made against cardiovascular disease over the last few decades. Despite its status as one of the oldest known endocrinopathies, the availability of a molecular therapy since 1920, and the existence of over a dozen drug classes approved for the management of the disease, we are largely unable to cure it and are losing the population battle in both the developed and developing worlds.

The population and healthcare costs are enormous and only expected to rise. Stoked by the snowballing obesity epidemic, diabetes affects over 29 million Americans, with more than 80 million at high risk. People with Asian, African, and American indigenous ancestry experience a higher risk, with the worldwide prevalence of diabetes expected to hit 500 million by 2030. In the USA alone, diabetes and its complications account for \$245 billion annually. With its concomitant life-threatening complications of cardiovascular disease, renal failure, visual loss, and peripheral vascular disease, T2D can undermine the global economy, with a disproportionate burden on underprivileged groups and low- and middle-income countries.

At the crux of our lack of clinical effectiveness lies our incomplete understanding of its pathogenesis, evolution, and metabolic consequences. Definite causal triggers, the interplay between various risk factors, and specific mechanisms that underlie long-term complications remain largely unknown. Thus, T2D has become the quintessential complex disease, with substantial genetic and environmental components, significant variation in prevalence across ethnic groups, pathophysiological heterogeneity, multiple treatment modalities, and poorly defined interactions with related metabolic phenotypes.

In the midst of many significant advances, key questions remain unanswered: Why do people develop T2D? Why do incidence rates differ across populations drawn from around the world? What causes beta cells to fail? How does obesity influence T2D risk? Can medications be designed that cure, rather than treat, diabetes? If more than one medication is needed, what is the best sequence or combination for specific subgroups?

These pressing questions also represent tantalizing opportunities. Our growing understanding of pathophysiology, the invention and deployment of global technologies that query specific areas of the biological space, and our improved ability to focus on the human as the targeted model system have placed the field of diabetes investigation on the verge of momentous discovery. However, among all valid experimental approaches employed in humans, only two can consistently bypass correlative associations and firmly establish causal inference. Beyond expensive and focused clinical trials, *the genetic method* is unique in ensuring that the exposure of interest (genotype) precedes phenotype, that it is conferred on individuals on a randomized basis at the time of conception, and that it is not in turn affected by the disease process or its treatment. Thus, it can serve as a powerful approach to dissect the nosology of T2D, illuminate its pathogenesis, and identify therapeutic targets through mechanistic insight.

In this volume, we have endeavored to take a contemporary snapshot of a rapidly moving field. In the time passed since Neel's initial cautionary statement, the scientific community has developed methods to measure global genomic variation with great precision, together with the statistical concepts and related analytical techniques that allow us to draw rigorous conclusions. Investigators have coalesced to advance knowledge in a collaborative fashion where needed, introducing appealing notions on the sociology of team science.

All of these ideas are illustrated in this book. The amount of novel information collected here, most of which was simply undreamed of just a decade ago, is staggering. At the same time, and reflecting the dizzying pace of discovery, nascent findings that have emerged most recently may not be fully captured in these chapters, making this reading all the more exciting. Finally, the organization of this work was intended to mirror the collaborative atmosphere that pervades our field, in that every chapter is authored by two or more investigators who hail from different research groups and yet complement each other in style, insight, and perspective.

The initial section, containing seven chapters, centers on fundamental genetic discovery. The initial overview provides a helpful historical viewpoint that will help the nongenetic reader take stock of the chronological evolution of the research enterprise in this area. From the proven effectiveness of genome-wide association studies (GWAS), subsequent contributions touch on the challenges that follow initial associations, the extension of this method to less accessible phenotypes,

and the arrival of next-generation sequencing as the harbinger of discovery focused on rare genetic variation.

The second section expands beyond genetics and illustrates how other data sources can inform initial genetic findings. Leveraging population diversity, correlating genetic associations with physiological measurements, learning from genetic variants that have strong phenotypic effects, and incorporating other key influences such as the modulation of gene expression, environmental factors, and our microbial commensals all help place genetic findings in focus and can lead to additional insight.

The third section makes a fundamental point: genetic association, however robust, is only the beginning of a laborious process. Convincing association signals notwithstanding, in most cases the specific DNA sequences that cause the molecular phenotype have not been identified. Indeed, the polymorphisms identified thus far merely signal genomic regions-at times hundreds of kilobases away from known genes-where an association has been found, but do not necessarily represent the causal variants: further fine-mapping and functional studies must be carried out before the true contribution of these loci to T2D can be accurately assessed. Thus, while we can rapidly and systematically uncover new associations, genetic studies do not circumvent the process of refining the associated loci to find the precise "causal" DNA sequences (causal in the sense of having a direct impact on RNA and/or protein quality or quantity that contributes to the diabetic phenotype). Indeed, variants may exert their molecular effects at remote sites even when they are relatively close to other uninvolved genes. Thus, loci identified by GWAS require in-depth sequencing and functional studies of the cellular and molecular effects of genes in that region. Six successful vignettes are described in this section, illustrating the progress we have made in just a few years.

The final section, comprising seven chapters, attempts to bring our current state of knowledge closer to the clinic, acknowledging both its potential and its limitations. It includes chapters on prediction, interaction of genetic variants with drugs or nutrients, and approaches to prevention or to the inference of causality for clinical relevant questions where randomized clinical trials have not produced conclusive answers or cannot be carried out. The epilogue, authored by a trio of long-standing collaborators who have set the pace for our field and whom many of us consider inspiring mentors, paints a realistic but hopeful vision of the future.

This book would not have been possible without the prescience of Andrea Pillmann at Springer in making the initial suggestion that we undertake this initiative, and without Jutta Lindenborn's patience in managing the editorial process. Over the years I have been fortunate to count on the professionalism and support of a superb publisher such as Springer in a variety of editorial projects, and this was no exception. I am most thankful to so many of my colleagues and friends who took time out of their busy professional lives to share their thoughts through eminently readable and informative chapters. Naturally not everyone who should or could have contributed was able to do so, but we have benefited from their wisdom as well, as this book largely reflects the collective body of knowledge garnered by the community over the past decade. Our remembrance goes to those luminaries

and pioneers who are no longer with us, such as Alan Permutt, Steve Elbein, and Linda Kao. And finally our mind rests in the smart, competent, and energized trainees we have the pleasure of working with, as they represent the bright future for our field: theirs will be the next edition in this fascinating journey of discovery, as we materialize our heartfelt commitment to ameliorate world suffering by improving human health.

Boston, MA

Jose C. Florez

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Part I Genetic Discovery

Chapter 1 Historical Overview of Gene Discovery Methodologies in Type 2 Diabetes

Amélie Bonnefond, Alan R. Shuldiner, and Philippe Froguel

Abstract This initial chapter presents a historical snapshot of the various approaches utilized to discover genes implicated in the pathogenesis of type 2 diabetes.

1.1 Introduction

In 1976, James V. Neel described type 2 diabetes as "a geneticist's nightmare" (Neel 1976). Forty years later, this statement holds true despite a plethora of different approaches and methodologies that have been used to discover genetic etiologies of monogenic and polygenic forms of type 2 diabetes (T2D) (Fig. 1.1); still, almost 30 % of patients presenting with putative monogenic diabetes do not have mutations in known causative genes (Vaxillaire et al. 2012), and all T2D-associated genetic variants identified to date explain less than 15 % of T2D heritability (Morris et al. 2012).

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© Springer International Publishing Switzerland 2016 J.C. Florez (ed.), *The Genetics of Type 2 Diabetes and Related Traits*, DOI 10.1007/978-3-319-01574-3_1

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Historical Overview of Methodology in Type 2 Diabetes

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Abbreviations: GWAS, genome-wide association study NGS, next-generation sequencing T2D, type 2 diabetes WES, whole-exomesequencing WGS, whole-genome sequencing

Fig. 1.1 (continued)

1.2 Family-Based Linkage Analysis

In 1992, the first successful methodology to identify genes involved in diabetes was targeted or genome-wide linkage analysis (using microsatellites or other highly polymorphic genetic markers) in pedigrees (both consanguineous and non-consanguineous) with maturity-onset diabetes of the young (MODY) and in patients with neonatal diabetes mellitus. In combination with Sanger sequencing of candidate genes under the peak(s) of linkage, and more recently wider sequencing approaches, this strategy has enabled the identification of many genes involved in these monogenic forms of diabetes (Fig. 1.1): GCK (Froguel et al. 1992; Froguel et al. 1993), HNF4A (Bell et al. 1991; Yamagata et al. 1996a), HNF1A (Vaxillaire et al. 1995; Yamagata et al. 1996b), CEL (Raeder et al. 2006), BLK (Borowiec et al. 2009), TRMT10A (Igoillo-Esteve et al. 2013), WFS1 (Inoue et al. 1998; Bonnycastle et al. 2013), PCBD1 (Simaite et al. 2014), INS (Støy et al. 2007), SLC19A2 (Labay et al. 1999), EIF2AK3 (Delépine et al. 2000), FOXP3 (Bennett et al. 2001), PTF1A (Sellick et al. 2004), GLIS3 (Senée et al. 2006), and IER3IP1 (Poulton et al. 2011). In polygenic forms of T2D, linkage analyses were far less successful, despite huge efforts of the research community. Only two T2D linkage signals were subsequently found to harbor variants in genes reproducibly associated with T2D (Fig. 1.1): HNF4A (Silander et al. 2004) and TCF7L2 (Grant et al. 2006). However, for reasons that are unclear, it is probable that the T2D-associated common variants in these genes do not explain the original linkage signal.

In patients from consanguineous families, homozygosity mapping (namely, the identification of regions of the genome that are homozygous in affected individuals) through DNA arrays in combination with sequencing of candidate genes within





homozygous loci has enabled the identification of several genes involved in neonatal diabetes associated with severe extrapancreatic clinical features (Fig. 1.1): *RFX6* (Smith et al. 2010), *MNX1* (Bonnefond et al. 2013; Flanagan et al. 2014) and *NKX2-2* (Flanagan et al. 2014).

Polygenic forms



Fig. 1.1 (continued)

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Fig. 1.1 Historical overview of methodology in type 2 diabetes (including monogenic and polygenic forms)

1.3 Candidate Gene Approaches

Candidate gene studies in which genes thought to be involved in glucose homeostasis are queried for sequence variation have been met with some success. Sequencing in families segregating atypical forms of early-onset nonimmune diabetes or syndromic conditions that include glucose intolerance has resulted in the identification of novel highly penetrant genes causing monogenic diabetes. By contrast, candidate genes for typical T2D involve querying variation in large numbers of unrelated T2D cases and nondiabetic controls to identify sequence variants enriched in the cases. These variants are typically common in the population and exert a small effect on T2D susceptibility. In a few examples, the same gene may harbor variants that have a large effect on function causing monogenic diabetes as well as more common variants that have a smaller effect on function and involved in polygenic T2D. Examples of successful identification of monogenic and polygenic diabetes genes using candidate gene approaches include:

MODY:

- 1. Key role in pancreatic beta cells: *PDX1* (Stoffers et al. 1997a), *NEUROD1* (Malecki et al. 1999), *KLF11* (Neve et al. 2005), and *PAX4* (Plengvidhya et al. 2007)
- 2. Genes belonging to a family that includes other genes previously shown to cause MODY, with a putative role in pancreatic beta cells: *HNF1B* (Horikawa et al. 1997)
- 3. Genes previously found to cause neonatal diabetes mellitus: *INS* (Meur et al. 2010) and *ABCC8* (Bowman et al. 2012)

Neonatal Diabetes Mellitus (Including Syndromic Forms):

- 1. Key role in pancreatic beta cells: *SLC2A2* (Santer et al. 1997), *KCNJ11* (Gloyn et al. 2004), *ABCC8* (Babenko et al. 2006), and *NEUROG3* (Rubio-Cabezas et al. 2011)
- 2. Genes previously found to cause MODY: *PDX1* (Stoffers et al. 1997b), *GCK* (Njølstad et al. 2001), and *NEUROD1* (Rubio-Cabezas et al. 2010)
- 3. Genes belonging to a family that includes other genes previously shown to cause MODY, with a putative role in pancreatic beta cells: *GATA4* (Shaw-Smith et al. 2014)

Polygenic Forms of T2D:

- 1. Key role in pancreatic beta cells or insulin sensitivity: *IRS1* (Almind et al. 1993), *KCNJ11* (Hani et al. 1998), *PPARG* (Deeb et al. 1998), and *WFS1* (Sandhu et al. 2007)
- 2. Genes previously found to cause a monogenic form of diabetes: *GCK* (Stone et al. 1996), and *HNF1B* (Winckler et al. 2007)

1.4 Genome-Wide Association Studies (GWAS)

Since 2007, GWAS and meta-analyses of GWAS in Europeans and other ethnicities have been very successful in identifying common single nucleotide polymorphisms (SNPs) significantly associated with T2D (please see Chap. 2). These GWAS have been based on high-throughput DNA microarrays assessing hundreds of thousands to few millions of SNPs across the genome in thousands of T2D cases and nondiabetic controls. GWAS of quantitative traits associated with T2D such as fasting plasma glucose, fasting serum insulin, and 2-h plasma glucose levels during an oral glucose tolerance test have also been quite successful in identifying new T2D-associated loci (Fig. 1.1). More recently, imputation of SNPs known from the 1000 Genomes project but not actually genotyped on the GWAS has boosted the number of analyzed SNPs (>6 million SNPs), enabling the identification of additional T2D-associated loci.

1.5 Next-Generation Sequencing (NGS) Approaches

Most recently, whole exome sequencing (WES) and whole genome sequencing (WGS) have become the most promising methodologies in finding new genes causing monogenic diabetes as well as novel loci associated with T2D risk. WES successfully identified two genes involved in monogenic diabetes (Fig. 1.1): *KCNJ11* in MODY (Bonnefond et al. 2012) (which was known to be mutated in patients with neonatal diabetes) and *GATA6* in neonatal diabetes (Lango Allen et al. 2012). Furthermore, WES performed in 2000 Europeans identified novel T2D-associated common variants in two genes: *COBLL1* and *MACF1* (Albrechtsen et al. 2013). Moreover, WES performed in 3756 Mexicans identified a low-frequency missense variant in *HNF1A* which strongly contributed to T2D risk (SIGMA Type 2 Diabetes Consortium et al. 2014). Finally, WGS of 2630 Icelanders and imputation (either direct imputation based on DNA array genotyping or in silico imputation based on genealogy information) into 11,000 cases and 267,000 controls of Icelandic origin identified T2D-associated low-frequency variants in three genes: *PAM*, *PDX1*, and *CCND2* (Steinthorsdottir et al. 2014).

1.6 Summary and Future Prospects

With increasing knowledge of genetic variation across the human genome, coupled with technological advances to query such variation, dramatic advances have been made in understanding the genetic basis of rare monogenic forms of diabetes as well as more common polygenic T2D. With these insights into the genetic architecture of diabetes, we now understand why family-based linkage analysis approaches were successful in identifying genes causing monogenic forms of diabetes, while large case-control GWAS approaches were more successful in identifying genes and loci for T2D susceptibility. While small-effect variants identified by GWAS do not contribute substantially to individual risk and are not useful clinically to predict who will develop diabetes, identification of these genes has provided new insights into underlying disease mechanisms. NGS applied to both family-based and population-based approaches promises to unveil even greater granularity of the genetic architecture of diabetes, underlying biological mechanisms, and novel approaches for treatment and prevention.

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Chapter 2 Genome-Wide Association Studies of Type 2 Diabetes

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Abstract Genome-wide association (GWA) studies represent the single most effective technique for identifying genetic risk loci causing complex diseases. Since the publication of the first GWA studies for type 2 diabetes (T2D) in 2007, nearly 90 statistically robust risk loci have been identified. The T2D risk loci identified by GWA studies contained several genes that are targets of current diabetic therapies; however, the majority of genes in these loci had not previously been implicated in the pathophysiology of T2D. Mechanistic insights about the physiological role of T2D loci in the disease predisposition have been gained from investigation of their contribution into glycemic trait variability in nondiabetic individuals. Current efforts to identify the causative genetic mutations in these loci and the molecular mechanisms through which they exert their effects have the potential to make far-reaching contributions to our understanding of molecular basis of T2D and the development of novel strategies for patient care.

2.1 Introduction

Type 2 diabetes (T2D) is a common, chronic disorder whose prevalence is increasing rapidly across the globe. Like other complex diseases, T2D represents a challenge for genetic studies aiming to uncover the underlying pathophysiological mechanisms. It is predicted that T2D will affect 592 million individuals by 2035 (Federation 2013) in developed and low- and middle-income countries. While the recent increase in T2D prevalence has been attributed to a sedentary "westernized"

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[©] Springer International Publishing Switzerland 2016 $L \subseteq F_{1} = \frac{1}{2} \sum_{i=1}^{n} \frac{1}{i} \sum_{j=1}^{n} \frac{1}{i} \sum_{j=1}^{i$

J.C. Florez (ed.), *The Genetics of Type 2 Diabetes and Related Traits*, DOI 10.1007/978-3-319-01574-3_2

lifestyle and changes in diet, a significant proportion of heritable factors also contribute to individual susceptibility (Hu 2011).

The strong family clustering and heritability of T2D and related glycemic traits have motivated a large number of studies to identify genetic factors that cause this disease (Permutt et al. 2005; Stumvoll et al. 2005); despite much effort, by late 2006 only three genetic loci had been reproducibly shown to increase T2D risk [reviewed in Majithia and Florez (2009), McCarthy (2008), Stolerman and Florez (2009)]. The earliest attempts to discover T2D-associated genes used either position- or function-based strategies. In a position-based search, genes are identified within families by studying the co-inheritance of the disease with a set of polymorphic markers whose genomic positions are known. Such "linkage studies" usually identify a genomic region (~10 Mbp) that confers genetic risk; the diseasecausative mutations are identified by sequencing transcribed and functional elements of all genes in the target region. In function-based approaches, risk association is tested for common genetic variants in candidate genes involved in T2D pathophysiology. In these studies, variants identified in a small number of patients and control subjects are genotyped in larger case-control samples. Both these approaches are characterized by a number of limitations. Linkage analysis is underpowered to detect low penetrance variants, expected to contribute to T2D susceptibility, given its high population prevalence. Candidate gene studies usually were conducted in samples of insufficient size and their findings had low reproducibility as well as difficulty to select good biological candidates.

Positional strategies have identified putative T2D loci in several large chromosome regions (McCarthy 2003) and in a number of specific genes (Horikawa et al. 2000; Meyre et al. 2005; Silander et al. 2004; Hara et al. 2002); however, none of these associations have been convincingly replicated. The candidate-gene approach generated a large number of positive reports, two of which have been confirmed in independent studies (Table 2.2) (Gloyn and McCarthy 2001). The Pro12Ala variant in the peroxisome proliferator-activated receptor gamma (PPARG) gene (Deeb et al. 1998; Altshuler et al. 2000; Lohmueller et al. 2003) and the Glu23Lys variant in the potassium inwardly rectifying channel, subfamily J, member 11 (KCNJ11) gene were shown to contribute to T2D risk in multiple studies (Gloyn et al. 2003; Laukkanen et al. 2004). Each of these two common variants contributes only modestly (increasing T2D risk by 15-20 % for each susceptibility allele) to the risk of developing common form of diabetes, while rare variants in both these genes cause monogenic diseases such as familial partial lipodystrophy and neonatal diabetes. Interestingly, these variants occur within pharmacological targets for the thiazolidinedione (PPARG) and sulfonvlurea compounds (KCNJ11) used to treat T2D.