## Predicting Diabetes Using Measures of $\beta$ -Cell Function

Adrian Vella<sup>1</sup> and Alan R. Zinsmeister<sup>2</sup>

ype 2 diabetes causes significant morbidity and mortality, making diabetes prevention a worthwhile goal. Impaired fasting glucose (IFG) and impaired glucose tolerance (IGT) have high rates of progression to type 2 diabetes. In Olmsted County, MN, 40% of people with a fasting glucose  $\geq 110 \text{ mg/dL pro-}$ gressed to overt diabetes within a 10-year period, compared with 5% of those with fasting glucose <95 mg/dL (1). What explains why 60% of people with a fasting glucose  $\geq$ 110 mg/dL did not progress to diabetes? One answer is that IFG encompasses individuals with differing glucose tolerance, some of whom might have normal glucose tolerance (NGT) whereas others have IGT (2). This is supported by the observation that postchallenge glucose concentrations are a better predictor of diabetes risk than fasting concentrations (3).

Maintenance of glucose tolerance is largely dependent on insulin secretion and insulin action—the ability of insulin to stimulate glucose uptake and suppress glucose release. Other parameters that may contribute to defects in glucose tolerance include hepatic insulin clearance, which determines systemic insulin bioavailability (4).

In this issue of *Diabetes*, Giannini et al. (5) examined the progression of glucose intolerance in obese adolescents, seeking to determine whether defects in insulin secretion and action are apparent within the normal range of glucose tolerance (based on 2-h glucose values). Fifty-five subjects with NGT and 20 with IGT were studied on two occasions,  $\sim 27$  months apart. Insulin secretion was derived from the hyperglycemic clamp and glucose tolerance test (OGTT), whereas insulin sensitivity was measured using a hyper-insulinemic-euglycemic clamp and the OGTT. Glucose tolerance was evaluated at baseline and follow-up, and predictors of follow-up 2-h glucose values were identified (5).

The authors make several interesting observations. One is that there are demonstrable differences in <sub>o</sub>DI (disposition index measured by OGTT) across groupings of individuals within the "normal" range of 2-h OGTT values. In addition, at least in terms of the DI calculated from clamp data (<sub>c</sub>DI) and the dynamic component of insulin secretion ( $\sigma^1$ ), no differences are apparent between individuals with IGT and those with a 2-h glucose value in the 120–139 mg/dL range. Finally, using a multiple stepwise regression analysis among subjects with NGT, age and <sub>c</sub>DI were the best predictors of 2-h glucose and therefore of conversion to IGT.

Corresponding author: Adrian Vella, vella.adrian@mayo.edu.

DOI: 10.2337/db11-1785

See accompanying original article, p. 606.

Although the relative importance of changes in insulin secretion and action in the temporal progression from NGT to IGT and overt diabetes has been debated, there are few studies in which  $\beta$ -cell function and insulin action were measured longitudinally. As such, this article is a step in the right direction. Insulin secretion and insulin action are both impaired in people with prediabetes and decline in tandem across the spectrum of glucose intolerance (2,6). This is supported by OGTT data despite use of an insulinbased measure of insulin secretion, which correlates weakly with acute insulin response (7). Insulin in the systemic circulation has undergone hepatic extraction (8), a process altered by factors such as obesity (9,10) or  $\beta$ -cell function (2,11). Consequently, reliance on insulin-based measures of secretion when comparing subjects with differing hepatic extraction can introduce a systematic error into such comparisons.

Although data from a frequently sampled OGTT can be used to generate accurate indices of insulin secretion and insulin action (12), the indices in this study relied instead on 0, 30, and 120 min measures of glucose and insulin. Given this limitation, it is not surprising that <sub>c</sub>DI performed a little better than <sub>o</sub>DI (or 2-h glucose values at study entry) in predicting IGT. Giannini et al. do not provide the predictive usefulness of the models they evaluated (e.g.,  $R^2$  values), or the corresponding partial  $R^2$  values for the variables included in each model. Thus, although it appears that DI values outperformed the predictive usefulness of the (study entry) 2-h glucose values, it is difficult to make an accurate assessment without these details (and corresponding partial regression plots).

As regards the lack of differences between subjects in the upper boundaries of NGT and those with IGT, it is important to point out the variability of 2-h glucose values in a given individual, which can result in reclassification of glucose tolerance status when using discrete categories of glucose tolerance (13). Subjects within a narrow band of glucose values (e.g.,  $140 \pm 10 \text{ mg/dL}$ ) may not differ that dramatically in terms of  $\beta$ -cell function.

Testing the integrity or degree of abnormality of a feedback-control system where glucose concentrations are closely regulated by insulin is perhaps best accomplished by using methodology that allows simultaneous measurement of insulin action and  $\beta$ -cell responsivity (4). Moreover, an oral challenge is perhaps a better reflection of normal physiology since it captures the incretin contribution to insulin secretion that may be another source of variation in response to meal challenges. Nevertheless, at present there is no good evidence to suggest-at least for the hormonal component of the insulin response—that differences in incretin hormone secretion contribute to the pathogenesis of prediabetes or diabetes (14,15). Finally, the relationship of insulin secretion to insulin action as reflected in the DI may differ across categories of glucose tolerance, and this may need to be accounted for in cross-sectional comparisons (16).

In conclusion, functional tests ranging in complexity from fasting and postchallenge glucose concentrations to

From the <sup>1</sup>Division of Endocrinology, Diabetes, Metabolism, and Nutrition, Mayo Clinic, Rochester, Minnesota; and the <sup>2</sup>Division of Biomedical Statistics and Informatics, Mayo Clinic, Rochester, Minnesota.

<sup>© 2012</sup> by the American Diabetes Association. Readers may use this article as long as the work is properly cited, the use is educational and not for profit, and the work is not altered. See http://creativecommons.org/licenses/by -nc-nd/3.0/ for details.

qualitative functional measures have been used to predict progression to diabetes. It remains to be ascertained if more sophisticated model-based measures of insulin secretion can help individualize diabetes risk and predict individual response to other secretagogues (including pharmacotherapy). The goal of using functional measures to characterize  $\beta$ -cell "integrity" and "mass" remains tantalizingly over the horizon. However, a systematic understanding of the limitations and the strengths of existing measures as well as the gaps in our knowledge base will enable us to chart a course to this destination.

## ACKNOWLEDGMENTS

This work was supported by the Mayo Clinic CTSA grant (RR24150). A.V. is supported by the National Institutes of Health National Institute of Diabetes and Digestive and Kidney Diseases grants DK78646 and DK82396. A.V. has served as a consultant to sanofi-aventis, Novartis, and Bristol-Myers Squibb. He has received grant support from Daiichi-Sankyo and Merck. No other potential conflicts of interest relevant to this article were reported.

## REFERENCES

- Dinneen SF, Maldonado D 3rd, Leibson CL, et al. Effects of changing diagnostic criteria on the risk of developing diabetes. Diabetes Care 1998;21: 1408–1413
- Sathananthan A, Man CD, Zinsmeister AR, et al. A concerted decline in insulin secretion and action occurs across the spectrum of fasting and post-challenge glucose concentrations. Clin Endocrinol (Oxf) 2012;76:212– 209
- Abdul-Ghani MA, Stern MP, Lyssenko V, Tuomi T, Groop L, Defronzo RA. Minimal contribution of fasting hyperglycemia to the incidence of type 2 diabetes in subjects with normal 2-h plasma glucose. Diabetes Care 2010; 33:557–561

- Cobelli C, Man CD, Sparacino G, Magni L, De Nicolao G, Kovatchev BP. Diabetes: models, signals, and control. IEEE Rev Biomed Eng 2009;2:54–96
- 5. Giannini C, Weiss R, Cali AM, et al. Evidence for early defects in insulin sensitivity and secretion before the onset of glucose dysregulation in obese youths: a longitudinal study. Diabetes 2012;61:606–614
- Bock G, Dalla Man C, Campioni M, et al. Pathogenesis of pre-diabetes: mechanisms of fasting and postprandial hyperglycemia in people with impaired fasting glucose and/or impaired glucose tolerance. Diabetes 2006; 55:3536–3549
- Tripathy D, Almgren P, Tuomi T, Groop L. Contribution of insulin-stimulated glucose uptake and basal hepatic insulin sensitivity to surrogate measures of insulin sensitivity. Diabetes Care 2004;27:2204–2210
- Caumo A, Luzi L. First-phase insulin secretion: does it exist in real life? Considerations on shape and function. Am J Physiol Endocrinol Metab 2004;287:E371–E385
- Polonsky KS, Given BD, Hirsch L, et al. Quantitative study of insulin secretion and clearance in normal and obese subjects. J Clin Invest 1988;81:435–441
- Rossell R, Gomis R, Casamitjana R, Segura R, Vilardell E, Rivera F. Reduced hepatic insulin extraction in obesity: relationship with plasma insulin levels. J Clin Endocrinol Metab 1983;56:608–611
- Meier JJ, Veldhuis JD, Butler PC. Pulsatile insulin secretion dictates systemic insulin delivery by regulating hepatic insulin extraction in humans. Diabetes 2005;54:1649–1656
- Dalla Man C, Campioni M, Polonsky KS, et al. Two-hour seven-sample oral glucose tolerance test and meal protocol: minimal model assessment of beta-cell responsivity and insulin sensitivity in nondiabetic individuals. Diabetes 2005;54:3265–3273
- Utzschneider KM, Prigeon RL, Tong J, et al. Within-subject variability of measures of beta cell function derived from a 2 h OGTT: implications for research studies. Diabetologia 2007;50:2516–2525
- Nauck MA, Vardarli I, Deacon CF, Holst JJ, Meier JJ. Secretion of glucagon-like peptide-1 (GLP-1) in type 2 diabetes: what is up, what is down? Diabetologia 2011;54:10–18
- 15. Smushkin G, Sathananthan A, Dalla Man C, et al. Defects in GLP-1 response to an oral challenge do not play a significant role in the pathogenesis of prediabetes. J Clin Endocrinol Metab. 16 November 2011 [Epub ahead of print]
- 16. Ferrannini E, Mari A. Beta cell function and its relation to insulin action in humans: a critical appraisal. Diabetologia 2004;47:943-956