



# Genetic Predictors of Change in Waist Circumference and Waist-to-Hip Ratio With Lifestyle Intervention: The Trans-NIH Consortium for Genetics of Weight Loss Response to Lifestyle Intervention

Jeanne M. McCaffery,<sup>1</sup> Kathleen A. Jablonski,<sup>2</sup> Qing Pan,<sup>2</sup> Arne Astrup,<sup>3</sup> Malene Revsbech Christiansen,<sup>4</sup> Dolores Corella,<sup>5</sup> Lauren M.L. Corso,<sup>1</sup> Jose C. Florez,<sup>6,7,8</sup> Paul W. Franks,<sup>9,10</sup> Christopher Gardner,<sup>11</sup> Torben Hansen,<sup>4</sup> Tuomas O. Kilpeläinen,<sup>4</sup> William C. Knowler,<sup>12</sup> Jaana Lindström,<sup>13</sup> Wim H.M. Saris,<sup>14</sup> Thorkild I.A. Sørensen,<sup>15</sup> Jaakko Tuomilehto,<sup>13,16,17</sup> Matti Uusitupa,<sup>18</sup> Rena R. Wing,<sup>19</sup> and Tanya Agurs-Collins<sup>20</sup>

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Genome-wide association studies have identified single nucleotide polymorphisms (SNPs) associated with waist circumference (WC) and waist-to-hip ratio (WHR) adjusted for BMI (WCadjBMI and WHRadjBMI), but it remains unclear whether these SNPs relate to change in WCadjBMI or WHRadjBMI with lifestyle intervention for weight loss. We hypothesized that polygenic scores (PS) comprised of 59 SNPs previously associated with central adiposity would predict less of a reduction in WCadjBMI or WHRadjBMI at 8–10 weeks in two lifestyle intervention trials, NUGENOB and DiOGenes, and at 1 year in five lifestyle intervention trials, Look AHEAD, Diabetes Prevention Program, Diabetes Prevention Study, DIETFITS, and

PREDIMED-Plus. One-SD higher PS related to a smaller 1-year change in WCadjBMI in the lifestyle intervention arms at year 1 and thus predicted poorer response ( $\beta = 0.007$ ; SE = 0.003;  $P = 0.03$ ) among White participants overall and in White men ( $\beta = 0.01$ ; SE = 0.004;  $P = 0.01$ ). At average weight loss, this amounted to 0.20–0.28 cm per SD. No significant findings emerged in White women or African American men for the 8–10-week outcomes or for WHRadjBMI. Findings were heterogeneous in African American women. These results indicate that polygenic risk estimated from these 59 SNPs relates to change in WCadjBMI with lifestyle intervention, but the effects are small and not of sufficient magnitude to be clinically significant.

<sup>1</sup>Department of Allied Health Sciences, University of Connecticut, Storrs, CT

<sup>2</sup>Department of Epidemiology, The Biostatistics Center, George Washington University, Rockville, MD

<sup>3</sup>Healthy Weight Center, Novo Nordisk Foundation, Hellerup, Denmark

<sup>4</sup>Novo Nordisk Foundation Center for Basic Metabolic Research, Faculty of Health and Medical Sciences, University of Copenhagen, Copenhagen, Denmark

<sup>5</sup>Department of Preventive Medicine and Public Health and CIBER Physiopathology of Obesity and Nutrition, University of Valencia, Valencia, Spain

<sup>6</sup>Diabetes Unit and Center for Genomic Medicine, Massachusetts General Hospital, Boston, MA

<sup>7</sup>Programs in Metabolism and Medical and Population Genetics, Broad Institute, Cambridge, MA

<sup>8</sup>Department of Medicine, Harvard Medical School, Boston, MA

<sup>9</sup>Department of Clinical Sciences, Genetic and Molecular Epidemiology Unit, Lund University Diabetes Centre, Lund University, Malmö, Sweden

<sup>10</sup>Harvard T.H. Chan School of Public Health, Boston, MA

<sup>11</sup>Department of Medicine, Stanford Prevention Research Center, Stanford, CA

<sup>12</sup>National Institute of Diabetes and Digestive and Kidney Diseases, Phoenix, AZ

<sup>13</sup>Population Health Unit, Finnish Institute for Health and Welfare, Helsinki, Finland

<sup>14</sup>Department of Human Biology, NUTRIM, School of Nutrition and Translational Research in Metabolism, Maastricht University Medical Centre, Maastricht, the Netherlands

<sup>15</sup>Novo Nordisk Foundation Center for Basic Metabolic Research and Department of Public Health, Section of Epidemiology, Faculty of Health and Medical Sciences, University of Copenhagen, Copenhagen, Denmark

<sup>16</sup>Department of Public Health, University of Helsinki, Helsinki, Finland

<sup>17</sup>Diabetes Research Group, King Abdulaziz University, Jeddah, Saudi Arabia

<sup>18</sup>Institute of Public Health and Clinical Nutrition, University of Eastern Finland, Kuopio, Finland

<sup>19</sup>Weight Control and Diabetes Research Center, The Miriam Hospital and Warren Alpert School of Medicine at Brown University, Providence, RI

<sup>20</sup>Division of Cancer Control and Population Sciences, National Cancer Institute, Rockville, MD

Corresponding author: [jeanne.mccaffery@uconn.edu](mailto:jeanne.mccaffery@uconn.edu)

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Obesity is a well-established risk factor for numerous diseases (1–3). Independent of elevated BMI, measures of central adiposity, such as waist circumference (WC), also predict many common diseases, including type 2 diabetes, cardiovascular disease, cancers, and early mortality (1,4–8). Indeed, it may be beneficial to measure WC clinically to more accurately reflect adiposity-related risk (9).

Genome-wide association studies (GWAS) have successfully identified genetic regions related to both WC and waist-to-hip ratio (WHR), even after statistical adjustment for BMI (WCadjBMI and WHRadjBMI, respectively) (10,11). Whereas several genes at loci associated with BMI are expressed in the central nervous system, many genes at loci related to WCadjBMI and WHRadjBMI reflect adipose tissue and insulin signaling pathways, highlighting a distinct genetic architecture for BMI and measures of central adiposity (10). In Mendelian randomization analyses, genetic markers related to higher WCadjBMI and WHRadjBMI were associated with type 2 diabetes, cardiovascular disease, and certain cancers (12–14), suggesting a causal role for central adiposity, independent of BMI, in the most common causes of morbidity and mortality in high- and middle-income countries.

Lifestyle interventions (LI) involving calorie restriction and often physical activity to promote weight loss reduce WC and WHR compared with minimal intervention control groups (e.g., placebo pill or brief health education alone) (15–18). Indeed, WC may serve as a better predictor of some of the health benefits of LI than change in weight per se (19,20). Knowledge about predictors of change in WC and WHR in response to LI could help tailor interventions for reducing central adiposity and identify actionable targets for WC or WHR reduction in the context of LI. This article examines whether polygenic scores (PS), comprised of 59 single nucleotide polymorphisms (SNPs) associated with WC, WHR, WCadjBMI, or WHRadjBMI in prior GWAS (10), predict the magnitude of change in these measures at two time points: 8–10 weeks and 1 year of LI. This analysis brings together data from seven LI trials, allowing testing of our central hypothesis that genetic variation associated with elevated WCadjBMI or WHRadjBMI will predict less of a reduction in these variables with lifestyle-induced weight loss intervention.

## RESEARCH DESIGN AND METHODS

### Research Design

This is a meta-analysis of LI trials for weight loss (16,21–28). The research designs and interventions are presented in Supplementary Table 1. Changes in WCadjBMI and WHRadjBMI were examined at 8–10 weeks in the Diet, Obesity and Genes (DiOGenes) Dietary Study and Nutrient-Gene Interactions in Human Obesity (NUGENOB) Study and at 1 year in Look AHEAD (Action for Health in Diabetes), Diabetes Prevention Program (DPP), Diabetes Prevention Study (DPS), Diet Intervention Examining the Factors Interacting with Treatment Success (DIETFITS), and PREDIMED (Prevención con Dieta Mediterránea)-Plus.

The time points were selected to maximize common outcomes across multiple trials. Funding sources and an extended author list for the trials can be found in Supplementary Document 1.

Analyses were conducted in the two most populous racial groups, White and African American, to reduce the risk of confounding due to population stratification (29). The response options for self-reporting these ancestries differed across trials and included African American/Black (Look AHEAD) African American or Black (DPP), African American (DIETFITS), White (Look AHEAD, DPP, and DIETFITS), Caucasian/White (DiOGenes), Caucasian European (NUGENOB), White/European (PREDIMED-Plus), and Finnish/European (DPS). In this article, we describe African American or Black self-reported race as African American and White or European self-reported race as White to have consistent language across trials. Individuals self-identifying as Hispanic were excluded from the African American or White subgroups.

All trials included an LI that incorporated calorie restriction to produce weight loss. The approach to macronutrient content and physical activity in the intervention differed across studies. Of the interventions with 8–10-week outcomes, DiOGenes used an 8-week low-calorie diet with meal replacements and extra vegetable provision; NUGENOB tested two low-calorie diets, one with 20–25% fat and the second with 40–45% fat over 10 weeks. Of the trials contributing 1-year outcomes, DPP LI, Look AHEAD intensive LI, and the “Healthy, low-fat” treatment arm of DIETFITS used a restriction of dietary fat intake. The DPS LI also used a restriction of fat intake but with increased fiber intake. The “Healthy, low-carbohydrate” arm of DIETFITS used a low-carbohydrate approach, and PREDIMED-Plus used an energy-restricted Mediterranean diet. The trials contributing 1-year data also included a physical activity promotion component. LI were pooled at 8–10 weeks and 1 year, respectively.

DPS, DPP, PREDIMED-Plus, and Look AHEAD included minimal contact control groups (education group, a placebo pill, Mediterranean diet without caloric restriction, and diabetes support and education, respectively). Although the nature of these control groups differs, we refer to these arms as “control” and test for PS × treatment arm and SNP × treatment arm interactions across these trials. Additional treatment arms that were not an LI or minimal-contact control arm, such as the DPP metformin treatment arm, were not included.

The primary independent variables are weighted PS comprised of the additive effects of associated alleles for 59 SNPs associated with WC, WHR, WCadjBMI, or WHRadjBMI in prior GWAS, weighted by the strength of association in published meta-analysis in ancestry-combined analyses (10). Of the 59 SNPs, 49 were initially associated with WHRadjBMI at genome-wide significance ( $5 \times 10^{-8}$ ), including 39 SNPs in sex-combined White samples, 8 additional SNPs in White women, 1 additional SNP in White men, and 1 additional SNP in ancestry- and

sex-combined analyses. Seven additional SNPs were initially associated with WCadjBMI in sex-combined analysis, and three additional SNPs were initially associated with WHR. As these phenotypes show substantial overlap and many of the SNPs were associated with multiple phenotypes, PS were created incorporating the 59 SNPs using weights for WCadjBMI and WHRadjBMI from the sex-combined, female, and male samples of combined ancestry presented in Supplementary Table 4 from Shungin et al. (10)

### Participants

A total of 7,646 participants were included in at least one analysis. At 8–10 weeks, 1,542 participants from LI were analyzed. No data from control groups were available (Supplementary Table 2A). At year 1, 6,104 contributed to at least one analysis, including 2,755 White participants in LI, 2,354 White participants in control arms, 506 African American participants in LI, and 489 African American participants in control arms (Supplementary Table 2B). Analyses were further conducted in men and women due to differences in effect sizes of genetic associations with WC and WHR by biological sex (10).

BMI entrance criteria ranged from  $\geq 25$  (DPP, DPS, Look AHEAD),  $\geq 26$  (NUGENOB),  $\geq 27$  (PREDIMED-Plus, DiOGenes), and  $\geq 28$  (DIETFITS). Additional inclusion criteria specific to trials included impaired glucose tolerance (DPP and DPS), metabolic syndrome (PREDIMED-Plus), and type 2 diabetes (Look AHEAD). Additional details of the study designs, inclusion and exclusion criteria, and intervention and control groups are summarized in Supplementary Table 1.

### Measures

#### Anthropometrics

At a minimum, all cohorts included a measure of WC and height and weight to calculate BMI. In addition, DPP, DPS, PREDIMED-Plus, DiOGenes, and NUGENOB included hip circumference for calculation of WHR. WC was measured in centimeters in duplicate using a tape measure midway between the bottom of the ribs and the top of the hips; hip circumference was measured in duplicate at the level of maximal hip protrusion. Weight was measured in duplicate with a digital scale or a balance beam scale, and height was measured in duplicate using a stadiometer. Details of anthropometric measurement are available for each cohort (16,21–26).

#### Genotyping

Genotyping platforms are listed in Supplementary Table 1. Briefly, Look AHEAD and DPS contributed SNPs directly genotyped on the Cardiometabochip (30); the remaining cohorts used genome-wide arrays. SNPs selected for inclusion in the PS and individual analyses included those related to WC, WHR, WCadjBMI, or WHRadjBMI identified in Shungin et al. (10). Proxies were identified ( $r^2 > 0.80$ ) if a SNP was not directly genotyped.

### Statistical Analysis

PS were calculated as number of effect alleles per SNP multiplied by the corresponding  $\beta$  weight from the combined ancestry results reported in Shungin et al. (10), summed and scaled across the 59 SNPs. Three separate PS were calculated using weights for associations with WCadjBMI in sex-combined, female, and male samples. Similarly, for WHRadjBMI, three additional PS were calculated using weights for associations with WHRadjBMI for application in females and males combined and the female and male subgroups.

Linear regression models were fit to analyze the association of the PS and individual SNPs with change in WCadjBMI and WHRadjBMI at 8–10 weeks and 1 year. The vast majority of participants in DiOGenes and NUGENOB were White, so there were no additional models by ancestry at 8–10 weeks. At 1 year, models were run in the two largest ancestry groups: White and African American. Age, biological sex (for the full sample), and baseline WCadjBMI or WHRadjBMI served as covariates. For LI trials with a low-contact control group (Look AHEAD, DPP, PREDIMED-Plus, and DPS), PS and individual SNP  $\times$  treatment arm interaction terms were also tested.

Meta-analysis with fixed effects for each trial was used to combine the results across DiOGenes and NUGENOB for 8–10-week change in WCadjBMI and WHRadjBMI and Look AHEAD, DPP, DPS, DIETFITS, and PREDIMED-PLUS for 1-year change in WCadjBMI and WHRadjBMI. As the PS reflect primary hypotheses, a level of  $P = 0.05$  was used to indicate statistical significance. False discovery rate (FDR) was used to account for multiple comparisons for tests of the individuals SNPs (31).

### Data and Resource Availability

As the data and resource sharing differs by trial, we provide statements for each trial. Look AHEAD data are available on the National Institute of Diabetes and Digestive and Kidney Diseases repository. The genetic data are not available due to limitations in consent. DPP data are available on the National Institute of Diabetes and Digestive and Kidney Diseases repository. The genetic data are available on dbGaP. DIETFITS data are available on request to C.G. (cgardner@stanford.edu). Due to limitations in genetic consent, the PREDIMED-Plus data are not publicly available. Collaborations will be considered upon request. DPS data are not publicly available due to limitations in consent. DiOGenes data are available from the DiOGenes Steering group for any interested researcher who meets the criteria for access to confidential data and upon reasonable request. The NUGENOB data are available on request to the Project Steering Committee (e-mail committee chair T.H., torben.hansen@sund.ku.dk).

### RESULTS

Descriptive statistics of demographics, PS, and the adiposity variables for the data used in the present meta-

analysis are provided in Supplementary Table 2A for trials contributing 8–10-week data (DiOGenes and NUGENOB) and Supplementary Table 2B for trials contributing 1-year data (Look AHEAD, DPP, DIETFITS, DPS, and PREDIMED-Plus). On average, participants across the trials were 35–60 years of age, and 55–75% were women. The European trials (DiOGenes, NUGENOB, DPS, and PREDIMED-Plus) were predominantly White; White and African American participants were included from the U.S. trials. Participants in all trials were on average in the obese range and tended to have clinically elevated WC.

### Change in WCadjBMI

#### Eight to Ten Weeks

None of the PS or individual SNPs significantly predicted change in WCadjBMI (Table 1, Supplementary Fig. 1, and Supplementary Table 3).

#### One Year

The PS weighted for WCadjBMI across men and women significantly predicted change in WCadjBMI in the White subgroup across the five clinical trials (Table 1 and Fig. 1A). The PS weighted in men also predicted change in WCadjBMI in the White male subset (Table 1 and Fig. 1C). Directionally consistent but nonsignificant results were seen in White women (Table 1 and Fig. 1B). In each case, the PS was associated with a higher WCadjBMI at 1 year, suggesting a poorer response to the LI. Taking the  $\beta$  of 0.007 (SE = 0.003 [95% CI 0.001, 0.013]) per SD higher WCadjBMI and the mean baseline (34.31 kg/m<sup>2</sup>) and mean 1-year reduction in BMI (−2.84 kg/m<sup>2</sup>) in White participants from DPP as an example, each SD of the PS contributed to a 0.20-cm (SE = 0.009) higher WC at 1 year in analyses combining men and women. For men under the same parameters, each SD of the PS contributed to a 0.28-cm (SE = 0.01) less change in WC.

Interactions with the intervention and control arms were tested in Look AHEAD, DPP, DPS, and PREDIMED-

Plus. In White men, there was an interaction of the PS with treatment arm at the level of borderline statistical significance ( $\beta$  = 0.011; SE = 0.005;  $P$  = 0.05 [95% CI −0.0002, 0.022]) (Supplementary Table 4). Results indicated that each SD change in the PS was associated with higher WCadjBMI at 1 year in the intervention arm ( $\beta$  = 0.010; SE = 0.004;  $P$  = 0.01 [95% CI 0.002, 0.019]) but nonsignificantly lower WCadjBMI in the control groups ( $\beta$  = −0.0015; SE = 0.004;  $P$  = 0.62 [95% CI −0.015, 0.006]). The interaction between intervention arm and PS in men and women combined and in women was not significant in White participants ( $P$  > 0.47; FDR  $q$  > 0.10) (Supplementary Table 4).

None of the individual SNPs was significantly associated with change in WCadjBMI in the LI arms (Supplementary Table 5) or in SNP  $\times$  treatment arm interaction (Supplementary Table 4) after correction for multiple comparisons in White participants.

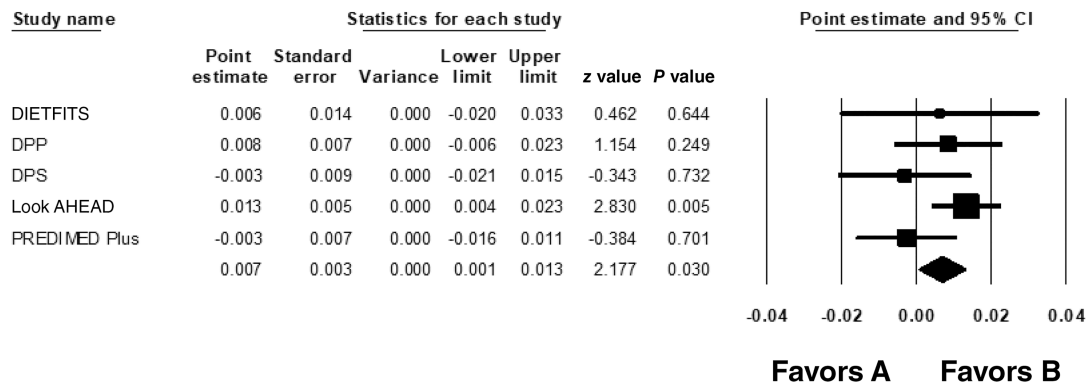
In African American participants, the PS weighted for WCadjBMI in women significantly predicted 1-year change in WCadjBMI in the LI arms in women. However, the heterogeneity score was 0.75, suggesting substantial difference in effect across studies (Table 1 and Fig. 2B). The effect was strongest in DIETFITS ( $\beta$  = 0.095; SE = 0.029;  $P$  = 0.001). In Look AHEAD ( $\beta$  = 0.026; SE = 0.015;  $P$  = 0.086) and DPP ( $\beta$  = −0.001; SE = 0.0018;  $P$  = 0.952), the effect size was small and not statistically significant. Thus, no clear pattern can be derived from the heterogeneous results. The PS weighted for men and women combined and the PS weighted for men were not significantly associated with change in WCadjBMI in the LI arm (Table 1 and Fig. 2A and C). No evidence for PS  $\times$  treatment arm or SNP  $\times$  treatment arm interaction was observed (Supplementary Table 6), and none of the individual SNPs predicted WCadjBMI in the lifestyle intervention arm after correction for multiple comparisons in African American participants (Supplementary Table 7).

**Table 1—PS associations with per-SD change in WCadjBMI at 8–10 weeks and year 1 in the LI arms**

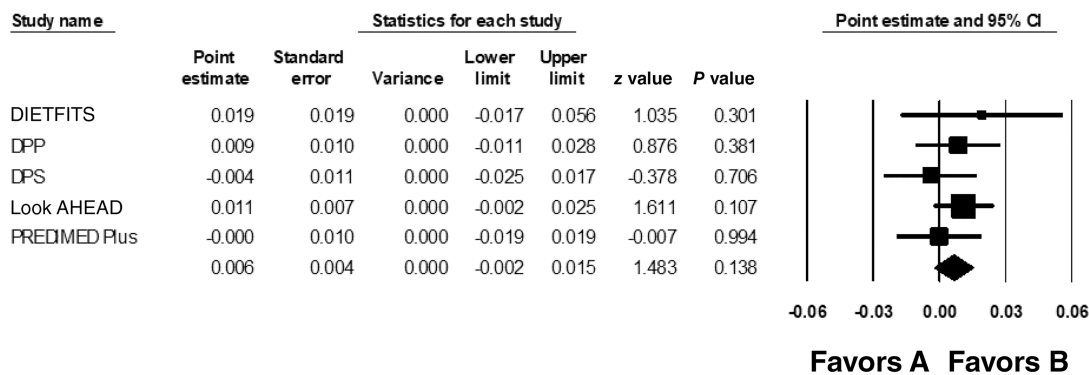
Time	Subsample	k	$\beta$	SE	Lower limit	Upper limit	z	P value	$I^2$
8–10 weeks	White participants								
	Full sample	2	0.002	0.004	−0.005	0.010	0.550	0.582	0
	Women	2	0.001	0.005	−0.008	0.011	0.236	0.814	0
	Men	2	0.008	0.006	−0.008	0.020	1.350	0.177	0
1 year	White participants								
	Full sample	5	0.007	0.003	0.001	0.013	2.2261	<b>0.026</b>	0.178
	Women	5	0.006	0.004	−0.002	0.015	1.483	0.138	0
	Men	5	0.010	0.004	0.002	0.019	2.533	<b>0.011</b>	0.171
	African American participants								
	Full sample	3	0.006	0.009	−0.011	0.024	0.707	0.479	0.226
	Women	3	0.026	0.011	0.005	0.047	2.393	<b>0.016</b>	0.753
	Men	2	−0.005	0.0111	−0.027	0.016	−0.479	0.632	0

k, number of cohorts.  $P$  < 0.05 indicated in bold.

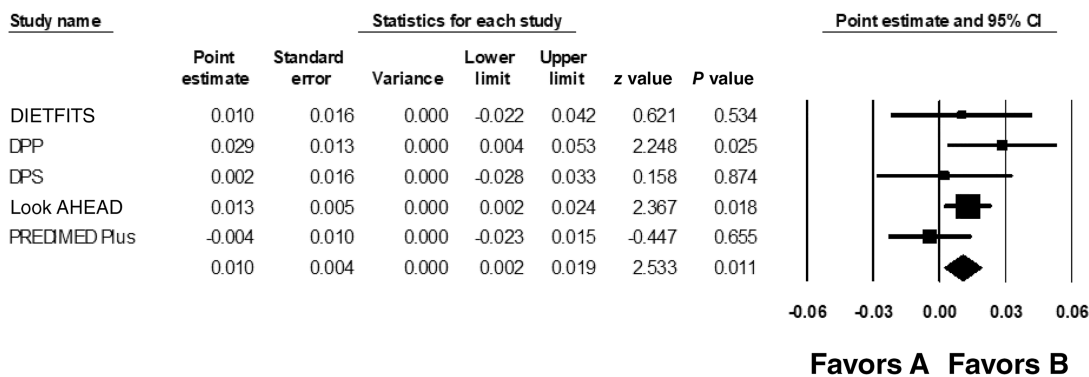
**A**



**B**



**C**



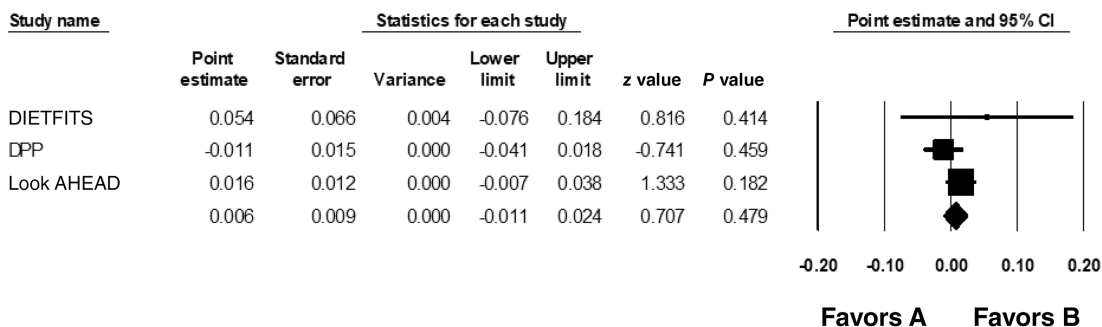
**Figure 1**—Meta-analysis of PS predicting 1-year change in WCadjBMI in all White participants (A), White women (B), and White men (C).

**Change in WHRadjBMI**

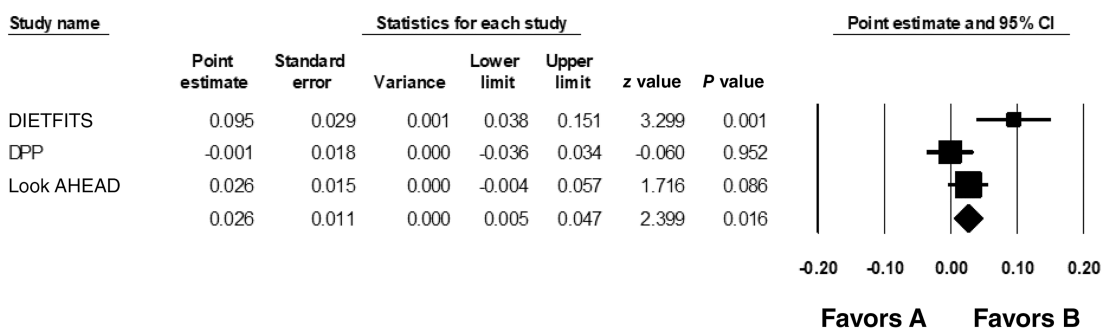
Neither the PS nor any of the SNPs significantly predicted change in WHRadjBMI in the LI at 8–10 weeks (PS,  $P > 0.10$ ; SNPs,  $FDR\ q > 0.10$ ) or at 1 year in the three of five trials (DPP, DPS, and PREDIMED-Plus) that provided data on WHRadjBMI at 1 year (White participants: PS,

$P > 0.29$ ; SNPs,  $FDR\ q > 0.10$ ; African American participants: PS,  $P > 0.36$ ; SNPs,  $FDR\ q > 0.10$ ). In addition, the PS and SNPs did not significantly interact with treatment arm at 1 year in White (PS,  $P > 0.57$ ; SNPs,  $FDR\ q > 0.10$ ) or African American participants (PS,  $P > 0.39$ ; SNPs,  $FDR\ q > 0.10$ ).

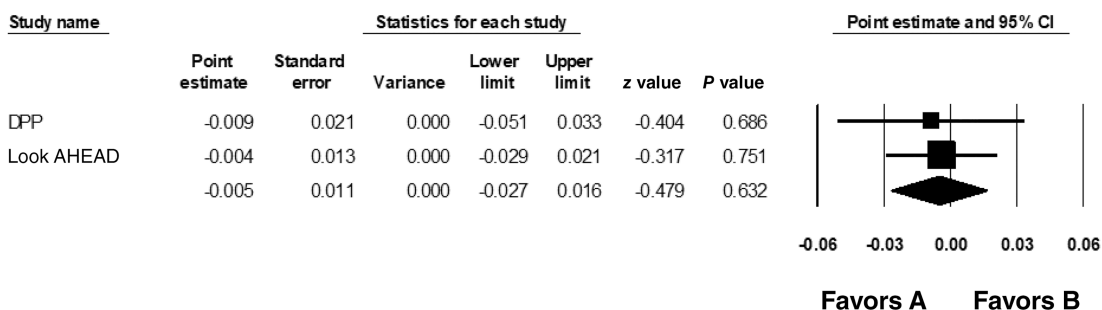
**A**



**B**



**C**



**Figure 2**—Meta-analysis of PS predicting 1-year change in WCadjBMI in all African American participants (A), African American women (B), and African American men (C).

**DISCUSSION**

We identified associations between genetic factors and change in WCadjBMI during LI aimed at weight reduction. A weighted PS comprised of 59 SNPs previously associated cross-sectionally with WC, WHR, WCadjBMI, or WHRadjBMI in the literature (10) predicted less of a reduction in WCadjBMI over 1 year in White men and women combined, and in White men alone. In White men and women combined, and in White men, 1 SD of the PS accounted for ~0.20–0.28 cm higher WC at year 1.

The PS did not predict change in WCadjBMI in African American participants overall or in African American men. In African American women, results were heterogeneous ( $I^2 = 0.75$ ) with no clear pattern across trials. Lack of clear association may be attributable to smaller sample sizes or less representation of individuals with African ancestry in ancestry-combined results from Shungin et al. (10). Associations were also not seen for WCadjBMI at 8–10 weeks, potentially due to a need for a longer intervention for these effects to be manifested. Individual



SNPs also were not significantly related to the WCadjBMI change at either 8–10 weeks or 1 year, potentially due to the smaller variance explained by individual SNPs relative to their additive effect. No significant associations were observed for change in WHRadjBMI at either 8–10 weeks or 1 year, potentially attributable to the smaller number of participants with hip data to calculate WHRadjBMI.

Overall, these results do indicate that some of the change in WC during LI is associated with polygenic risk, but the magnitude of genetic effects attributable to the 59 SNPs remains relatively small when compared with the impact of LI on WC at year 1. One-year WC change in Look AHEAD, DPP, DPS, and PREDIMED-Plus in the LI arms were a mean  $\pm$  SD of  $-6.2 \pm 10.2$  cm (15),  $-6.6 \pm 7.3$  cm (18),  $-4.4 \pm 5.2$  cm SD (16), and  $-3.1$  cm (95% CI  $-3.8$  to  $-2.5$ ) (17), respectively. With a 0.20 cm difference in WC per SD of the PS in White men and women combined, the difference between the 5th and 95th percentile is  $\sim 0.80$  cm. For White men, the difference of 0.28 cm WC per SD translates to a difference of 1.12 cm between the 5th and 95th percentile.

In precision medicine applications, genetics or genomics are used to improve diagnosis, guide pharmacological treatments, and identify contributing pathways to tailor interventions. In this study, the score comprised of 59 SNPs predicted change in WCadjBMI in evidence-based LI, but the association was small in comparison with the 3–6-cm mean WC changes observed in the contributing clinical trials. This is not sufficient to alter recommendations for LI as an evidence-based method to reduce WC. In addition, no single SNP significantly predicted change in WCadjBMI, suggesting that the combination of the variants was more predictive, as might be expected for a polygenic trait. Taken together, our results do not lend themselves to changes in clinical recommendations or identification of specific pathways contributing to change.

A major strength of this analysis is the inclusion of five effective LI trials with 1-year data and two effective lifestyle/diet interventions with 8–10-week data. Many of these trials represent the gold standard of LI in the field with well-described trials, some of the largest sample sizes, and published intervention materials. Several cohorts also included comparison groups, allowing us to explore PS and SNPs by intervention arm interactions.

Weaknesses of this study include the unavoidable heterogeneity of combining across clinical trials, both in terms of compositions of the cohorts and interventions applied, lack of sufficient data to explore PS  $\times$  macronutrient composition interaction, relatively small sample sizes to examine associations within African Americans and other ancestry groups, and a lack of data on WHR in several of the clinical trials.

In summary, this meta-analysis across multiple LI clinical trials revealed that a PS comprised of 59 SNPs, previously associated with central adiposity, predicted less reduction in WCadjBMI over 1 year. These results indicate

that genetic variants related to central adiposity associate with the change in WCadjBMI with LI, but the differences related to these PS are relatively small in comparison with the overall benefit of these interventions for reducing WC.

**Duality of Interest.** J.C.F. has received speaking honoraria from Novo Nordisk, AstraZeneca, and Merck for research talks over which he had full control of content and consulting honoraria from AstraZeneca and Goldfinch Bio. P.W.F. has received consulting honoraria from Eli Lilly and Company and Novo Nordisk A/S; has received research grants from multiple pharmaceutical companies; is a consultant and stock owner in Zoe Global Ltd; and is currently the Scientific Director in Patient Care at the Novo Nordisk Foundation. No other potential conflicts of interest relevant to this article were reported.

**Author Contributions.** J.M.M. conceptualized the paper, contributed to data curation, formal analysis and methodology, wrote the original draft, and contributed to review and editing. K.A.J. conceptualized the paper and contributed to data curation, methodology, formal analysis, and review and editing. Q.P. contributed to conceptualization, methodology, formal analysis, and review and editing. A.A. contributed to data curation and review and editing. M.R.C. contributed to formal analysis, review, and editing. D.C. contributed to data curation and to review and editing. L.M.L.C. contributed to writing the original draft and review and editing. J.C.F. contributed to data curation and to review and editing. P.W.F. contributed to data curation and to review and editing. C.G. contributed to data curation and to review and editing. T.H. contributed to data curation and to review and editing. T.O.K. contributed to data curation and to review and editing. W.C.K. contributed to data curation and to review and editing. J.L. contributed to data curation and to review and editing. W.H.M.S. contributed to data curation and to review and editing. T.I.A.S. contributed to data curation and to review and editing. J.T. contributed to data curation and to review and editing. M.U. contributed to data curation and to review and editing. R.R.W. contributed to data curation and to review and editing. T.A.-C. contributed to conceptualization, review, and editing. J.M.M., K.A.J., and Q.P. are the guarantors of this work and, as such, had full access to all of the data in the study and take responsibility for the integrity of the data and the accuracy of the data analysis.

**Prior Presentation.** This study was presented at the 81st Scientific Sessions of the American Diabetes Association, 25–29 June 2021.

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