Impact of Food-Based Weight Loss Interventions on Gut Microbiome in Individuals with Obesity: A Systematic Review

Aleisha Bliesner 1, Jade Eccles-Smith 2,3, Claire Bates 1, Olivia Hayes 1, Jet Yee Ho 1, Catia Martins 4,5,6, Helen Truby 1 and Marloes Dekker Nitert 7,*

1 School of Human Movement and Nutrition Sciences, The University of Queensland, Brisbane, QLD 4067, Australia; a.bliesner@uq.edu.au (A.B.); c.bates@uq.net.au (C.B.); o.hayes@uq.net.au (O.H.); jetye.ho@uq.net.au (J.Y.H.); h.truby@uq.edu.au (H.T.)
2 Department of Obstetric Medicine, The Royal Brisbane and Women’s Hospital, Brisbane, QLD 4029, Australia; jade.ecclessmith@uqconnect.edu.au
3 Mater Research Institute, The University of Queensland, Brisbane, QLD 4101, Australia
4 Department of Clinical and Molecular Medicine, Norwegian University of Science and Technology, 7034 Trondheim, Norway; catia197@uab.edu
5 Centre for Obesity and Innovation (ObeCe), St. Olav University Hospital, 7006 Trondheim, Norway
6 Department of Nutrition Sciences, University of Alabama at Birmingham, Birmingham, AL 35294, USA
7 School of Chemistry and Molecular Biosciences, The University of Queensland, Brisbane, QLD 4067, Australia
* Correspondence: m.dekker@uq.edu.au; Tel.: +61-7-3365-4633

Abstract: The observation that the gut microbiota is different in healthy weight as compared with the obese state has sparked interest in the possible modulation of the microbiota in response to weight change. This systematic review investigates the effect of food-based weight loss diets on microbiota outcomes (α-diversity, β-diversity, relative bacterial abundance, and faecal short-chain fatty acids, SCFAs) in individuals without medical comorbidities who have successfully lost weight. Nineteen studies were included using the keywords ‘obesity’, ‘weight loss’, ‘microbiota’, and related terms. Across all 28 diet intervention arms, there were minimal changes in α- and β-diversity and faecal SCFA concentrations following weight loss. Changes in relative bacterial abundance at the phylum and genus level were inconsistent across studies. Further research with larger sample sizes, detailed dietary reporting, and consistent microbiota analysis techniques are needed to further our understanding of the effect of diet-induced weight loss on the gut microbiota.

Keywords: diet; weight loss; obesity; microbiota; microbiome; alpha-diversity; beta-diversity; short-chain fatty acids

1. Introduction

The rate of overweight and obesity is steadily increasing worldwide, affecting over 1.9 billion adults in 2016 according to the World Health Organization [1]. Obesity is associated with a number of chronic diseases including cardiovascular disease, type 2 diabetes, and certain cancers, which place a significant economic burden on the healthcare system [2,3]. Whilst the obese state has traditionally been attributed to energy intake in excess of energy expenditure, more recently, genetics, epigenetics, and the microbiome have been implicated in the aetiology of obesity [4,5]. Lifestyle modification, including dietary changes, remains the recommended first-line intervention for weight loss.

The human colon is home to $10^{14}$ microorganisms, which interact with multiple systems to influence host health [6]. Microbial composition and short-chain fatty acid (SCFA) production are both influenced by the host diet and the composition of the microbiota has been implicated in the development and maintenance of the obese state. Ley et al. [7] first observed that individuals with obesity had a higher ratio of Firmicutes to Bacteroidetes compared to their lean counterparts. Ridaura et al. [8] demonstrated a causal relationship...
between the microbiota and obesity by transplanting faecal microbiota from twins discordant for obesity into germ-free mice. Mice receiving faecal transplants from the obese twins gained significantly more weight than those transplanted with the microbiota of the lean twins, and this correlated with lower SCFA production in the obese recipient mice.

Numerous studies have aimed to identify the most successful macronutrient composition for weight loss. A recent meta-analysis has shown both low-fat and low-carbohydrate diets to be effective for weight loss, with little difference between the two [9]. Long-term weight maintenance, however, remains difficult, with only 28% of adults maintaining a loss of 10% body weight after 4 years [10]. While similarly effective for short-term weight loss, different macronutrient ratios may affect long-term success, potentially via modulation of the gut microbiota, though the exact mechanism remains unknown.

The purpose of this systematic review was to investigate the effect of food-based weight loss diets varying in macronutrient composition on microbiota outcomes (α- and β-diversity, relative bacterial abundance, and SCFA production) in healthy but obese individuals who had lost at least 2 kg of weight attributed to changing their food intake.

2. Materials and Methods

2.1. Search Strategy

An electronic literature search was performed on the following databases: PubMed, Scopus, CINAHL, and Embase. Searches were performed on the same day, without filters, including literature from database inception until 26 October 2021. Database searches were performed using the terms ‘overweight’ or ‘obesity’ and ‘weight loss’, and ‘microbiota’ or ‘microbiome’ and related terms (see Table S1).

2.2. Study Selection

Studies that met the following criteria were included: (1) subjects must be healthy adults (18–70 years old) with overweight or obesity (BMI > 25 kg/m²), (2) subjects must have achieved ≥2 kg weight loss induced by a hypocaloric diet or a combination of a hypocaloric diet and other lifestyle interventions, and (3) studies that assessed α-diversity, β-diversity, bacterial abundance, or SCFA concentrations. Studies were excluded if they were: (1) published in a language other than English, (2) an abstract only, (3) conducted in animals, children, adolescents, pregnant women, or subjects with chronic illnesses/morbidities, (4) used pre- or probiotics only, faecal microbiota transplant, herbal medicines, pharmacotherapy, a single food only (e.g., avocado), Glucagon-like-peptide 1 (GLP-1) or other gut hormones/peptides, or supplement-based very-low-calorie diets (e.g., Optifast). If a multi-arm trial had a single weight loss intervention arm meeting the above criteria, this specific arm was included and treated as a single-arm trial for analysis.

References were imported into an online screening and data-extraction tool (Covidence, v2815) and duplicates were removed following a 2-step process: automatic removal by Covidence, followed by manual removal by two reviewers. The two independent reviewers (A.B. and J.E.-S.) screened articles based on title and abstract against the eligibility criteria. Studies included were assessed based on their full text to produce the final selection of eligible studies. Disagreements were resolved through consensus-based discussions or by a third reviewer’s opinion.

2.3. Data Extraction

Two independent reviewers (A.B. and J.E.-S.) extracted data from each full-text including Supplementary Materials using a pre-specified data-extraction template. Information on the first author, publication year, country where the study was conducted, study design, type of intervention, sample size, participant characteristics (sex, age, BMI), duration of intervention, and changes in weight, α- and β-diversity, bacterial abundance, and SCFAs were extracted. Disagreements were resolved through consensus or with a third reviewer. We did not contact study authors for additional information.
2.4. Risk of Bias

A risk-of-bias (RoB) assessment was conducted for each study by two independent reviewers (A.B. and J.E.-S.) using the Cochrane RoB tool [11]. The older version of the tool was used as the updated RoB2 is less suited to dietary studies due to difficulties with blinding and a lack of placebo in dietary interventions. RoB was assessed on the basis of sequence generation, allocation concealment, the blinding of participants and personnel for all outcomes, incomplete outcome data for faecal microbiota composition, selective outcome reporting, and other sources of bias. Each criterion was graded as having a high, low, or unclear RoB. Discrepant assessments were resolved by consensus reached through discussion between the two reviewers.

3. Results

3.1. Study Selection

A total of 2741 records were retrieved by the database search, out of which 1290 duplicates were removed. A further 1367 records were excluded after title/abstract screening and the full-texts of the remaining 84 articles were assessed for eligibility. Sixty-five articles were excluded following full-text review while nineteen studies were retained for inclusion in this review. A detailed flowchart showing the study selection process is presented in Figure 1. Excluded full-texts with justifications are provided in Table S2.

![Figure 1. Flow diagram for study selection.](image-url)
3.2. General Study Characteristics

Characteristics of the included studies are presented in Table 1. A total of 28 dietary interventions of interest were identified across the 19 included studies. Geographically, seven (37%) of the studies were performed in North America, seven (37%) in Europe, three (16%) in the United Kingdom, and two (11%) in East Asia. The publication dates of the included studies ranged from 2006 to 2021, with 16 (84%) studies published within the last 3 years. The mean number of participants enrolled in each dietary intervention arm was 39 (range, 6–97). Two studies (11%) were carried out exclusively in men, fifteen (79%) included both men and women, and two (11%) did not report on the sex of the participants. Mean age of participants ranged from 37 to 64 years old. Participants were either overweight or obese at baseline, with mean BMIs ranging from 26.6 to 36.6 kg/m². Duration of each dietary intervention arm ranged from 10 days to 12 months. Fourteen studies used 16S rRNA gene amplicon sequencing to characterise the gut microbiota, two studies used shotgun metagenomic sequencing, one study used 16S rRNA-based quantitative FISH, and one study used a combination of qPCR and 16S rRNA amplicon sequencing.

Table 1. Characteristics of included studies.

| Trial, Country                  | n (Female) | Age, Years | BMI, kg/m² | Intervention Protocol                                                                 | Duration | Microbiota Analysis Method |
|---------------------------------|------------|------------|------------|--------------------------------------------------------------------------------------|----------|----------------------------|
| Bendsten 2018, Denmark [12]     | 40 (35)    | 42 (1)     | 31.5 (0.4) | High-dairy diet: 18% P, 52% C, 30% F, 500 kcal/day deficit, 1500 mg calcium/day        | 24 weeks | 16S rRNA (V3–V4)           |
|                                 | 40 (34)    | 45 (2)     | 30.8 (0.4) | Low-dairy diet: 18% P, 52% C, 30% F, 500 kcal/day deficit, 600 mg calcium/day         | 24 weeks | 16S rRNA (V3–V4)           |
| Benítez-Páez 2021, Denmark [13] | 59 (39)    | 48.9 (8.6) | 32.8 (3.9) | Calorie-restricted diet + fibre: 18–20% P, 52–53% C, 32–33% F, 500 kcal/day deficit, 14–22 g/day fibre + 20 g/day prebiotic fibre supplement (10 g inulin + 10 g resistant maltodextrin) | 12 weeks | Shotgun metagenomics       |
|                                 | 57 (37)    | 48.4 (8.3) | 34.4 (4.4) | Calorie-restricted diet + placebo: 18–20% P, 52–53% C, 32–33% F, 500 kcal/day deficit, 14–22 g/day fibre + placebo supplement (maltodextrin) | 12 weeks | Shotgun metagenomics       |
| Cuevas-Sierra 2021, Spain [14]  | 82 (54)    | NR         | NR         | Moderately high-protein diet: 30% P, 40% C, 30% F, 30% energy restriction              | 16 weeks | 16S rRNA (V3–V4)           |
|                                 | 97 (70)    | NR         | NR         | Low-fat diet: 18% P, 60% C, 22% F, 30% energy restriction                             | 16 weeks | 16S rRNA (V3–V4)           |
| Dhakal 2020, USA [15]           | 58 (44)    | 45.7 (15.8)| 34.6 (7.2) | Retail weight reduction program                                                      | 12 weeks | 16S rRNA (V4)              |
| Dong 2020, USA [16]             | 43 (10)    | 55.9 (10.1)| 34.9 (4.5) | High-protein diet: 30% P, 40% C, 30% F, 3 weeks ad libitum then 6 weeks 500 kcal/day deficit | 8 weeks  | 16S rRNA (V4)              |
|                                 | 37 (8)     | 55.7 (11.4)| 34.6 (5.1) | Normal-protein diet: 15% P, 55% C, 30% F, 2 weeks ad libitum then 6 weeks 500 kcal/day deficit | 8 weeks  | 16S rRNA (V4)              |
| Duncan 2008, Scotland [17]      | 23 (0)     | NR         | >30        | High-protein, moderate-carbohydrate, non-ketogenic diet: 30% P, 35% C, 35% F, <3.5 MJ/day, 164 g/d CHO, 12.2 g/day non-starch polysaccharide  | 4 weeks  | 16S rRNA-based quantitative FISH |
| Fragiadakis 2020, USA [18]      | 25 (20)    | 42.6 (5.6) | 32.8 (3.9) | Low-carbohydrate diet                                                                | 12 months| 16S rRNA (V4)              |
|                                 | 24 (19)    | 39.2 (5.5) | 33.7 (3.5) | Low-fat diet                                                                        | 12 months| 16S rRNA (V4)              |
| Trial, Country | n (Female) | Age, Years | BMI, kg/m² | Intervention Protocol | Duration | Microbiota Analysis Method |
|---------------|------------|------------|------------|-----------------------|----------|---------------------------|
| Gratz 2019, Scotland [19] | 18 (0) | 49 (12) | 36.6 (5.8) | Participants followed a 7-day weight maintenance diet followed by three 10-day weight loss diets in a randomized crossover design without washout: 1. Normal-protein diet: 15% P, 55% C, 30% F, energy = 1 × BMR 2. Normal-protein diet enriched with free amino acids and moderate amounts of carbohydrate: 15% P, 15% free amino acids, 40% C, 30% F, energy = 1 × BMR 3. High-protein diet containing moderate amounts of carbohydrate: 30% P, 40% C, 30% F, energy = 1 × BMR | 37 days | None |
| Gutiérrez-Repiso 2021, Spain [20] | 21 (11) | 64.0 (4.7) | 33.4 (3.3) | Mediterranean diet: 20% P, 40–45% C, 35–40% F, 8–10% SFA, 600 kcal/day deficit, 150 min/week walking | 6 months | 16S rRNA (NR) |
| Jaagura 2021, Estonia [21] | 27 (NR) | NR | 28.9–44.4 | Low-carbohydrate, high-fat weight loss diet: 30 ± 10% energy deficit | 4 weeks | 16S rRNA (V3–V4) |
| Johnstone 2020, UK [22] | 24 (16) | 20–62 | 32.8 (4.07) | Weight loss diet: 30% P, 40% C, 30% F, 25 g/day fibre, energy intake = RMR | 3 weeks | qPCR, 16S rRNA (NR) |
| Kahleova 2020, USA [23] | 84 (69) | 52.9 (11.7) | 32.6 (3.7) | Low-fat vegan diet: 20–30 g/day fat, high in vegetables, grains, legumes, and fruit, instructed to avoid animal products and added oil, vitamin B12 supplemented (500 µg/day) | 16 weeks | 16S rRNA (V4) |
| Kahleova 2021, USA [24] | 62 (48) | 57.4 (NR) | 34.0 (NR) | Low-fat vegan diet: consisted of fruits, vegetables, grains, and legumes. Animal products and added fats were excluded. Vitamin B12 was supplemented (500 µg/day) | 16 weeks | 16S rRNA (V4) |
| Ley 2006, USA [7] | 6 (4) | 53.7 (NR) | >30 | Fat-restricted diet: 30% F, 10–15 g/day fibre, 1200–1500 kcal/day for women, 1500–1800 kcal/day for men Carbohydrate-restricted diet: 25% C, 10–15 g/day fibre, 1200–1500 kcal/day for women, 1500–1800 kcal/day for men | 12 months | 16S rRNA (NR) |
| Ma 2021, China [25] | 25 (25) | NR | 26.6 (0.5) | Low-carbohydrate diet: 20 g/day carbohydrates in the first week, then 10 g/day extra weekly until reaching 120 g/day at the end of the intervention Calorie-restricted diet: 1200 kcal/day, 20% P, 55% C, 25% F, 10% SFA, 300 mg/day cholesterol | 12 weeks | Shotgun metagenomics |
| Nogacka 2021, Spain [26] | 9 (4) | 49.67 (7.81) | >40 | Hypocaloric diet: 15% P, 55% C, 30% F, <10% SFA, 20–25 g/day fibre, 20 kcal/kg body weight (~1800–2000 kcal/day) | 6–8 months | 16S rRNA (NR) |
Table 1. Cont.

| Trial, Country               | n (Female) | Age, Years | BMI, kg/m² | Intervention Protocol                                                                 | Duration | Microbiota Analysis Method |
|------------------------------|------------|------------|------------|---------------------------------------------------------------------------------------|----------|----------------------------|
| Pisanu 2020, Italy [27]      | 23 (20)    | 53 (9)     | 35.2 (4.3) | Mediterranean diet: 20% P, 55% C, 25% F, ≥25 g/day fibre, energy = BMR (±10%)         | 3 months | 16S rRNA (V3–V4)           |
| Stanislawski 2021, USA [28]  | 71 (NR)    | 40.7 (9.8) | 33.1 (4.4) | Energy-restricted diet: 34% weekly energy deficit achieved through either daily caloric restriction or intermittent fasting (80% energy deficit on 3 non-consecutive days each week). Moderate intensity physical activity: 300 min per week. | 12 weeks | 16S rRNA (V3–V4)           |
| Zhang 2021, China [29]       | 26 (22)    | 36.58 (8.70) | 30.44 (3.38) | Low-carbohydrate diet: 10–25% C, no energy restriction                              | 12 weeks | 16S rRNA (V3–V4)           |

% p: percent of energy from protein, % C: percent of energy from carbohydrates, % F: percent of energy from fat; M: males, F: females, NR: not reported, FISH: fluorescence in situ hybridization. Age and BMI reported as mean (SD).

3.3. Dietary Intervention Characteristics

Fourteen (74%) studies reported on the macronutrient intake of participants during the intervention (Tables 2 and 3). Macronutrient distribution ranged from 12% to 34% of energy from protein, 16% to 73% of energy from carbohydrates, and 13% to 50% of energy from fat. Energy intake, reported by 11 studies (58%), ranged from 1195 to 2154 kcal/day. Eleven studies (58%) reported on dietary fibre intake, which ranged from 10 to 33 g per day, and three (16%) reported on the amount of soluble and insoluble fibre consumed.

3.4. Weight Loss

The mean weight loss across the 28 interventions was ~6 kg (Tables 2 and 3). The lowest amount of weight loss achieved was 2.8 kg in two interventions lasting 3 and 8 weeks, respectively [16,22], while the largest amount of weight lost was 15.4 kg in a year-long intervention [7].

3.5. Changes in α-Diversity

Twenty-four interventions (86%) reported on α-diversity changes (Table 2). Eighteen (75%) produced no changes in α-diversity, while three (13%) increased α-diversity. These three interventions included an 8-week high-protein diet [16], a 6-month Mediterranean diet [20], and a 12-week energy-restricted diet [28]. A 16-week low-fat diet increased α-diversity in men but not women [14], while another study found an increase in OTU richness but not Shannon (diversity and richness) index following a 12-week weight reduction program [15]. One study which assigned omnivores to a 16-week vegan diet resulted in a decrease in α-diversity [24], however no changes were found following a similar intervention from the same research group [23].

3.6. Changes in β-Diversity

While not directly related to health outcomes, changes in β-diversity (i.e., the interindividual variation in microbiome composition) indicate whether an intervention had an overall effect on the microbiota. Seventeen interventions (61%) included in this review reported on β-diversity, eleven (65%) of which found no changes post-intervention (Table 2). Two (12%) resulted in a decrease in β-diversity: a 4-week low-carbohydrate, high-fat diet [21] and a 12-week low-carbohydrate diet [25]. β-diversity decreased at 3 months on another low-carbohydrate diet, but returned to baseline levels by 6 months [18]. Three other studies found a change in β-diversity [14,27,28] (one study in men only [14]), but these results were reported graphically and the direction of change could not be determined. No interventions reported increased β-diversity.
## Table 2. Summary of the microbiota changes of included studies.

| Trial                                      | Reported Dietary Intake                                                                 | Weight Loss, kg | α-Diversity | β-Diversity | Relative Bacterial Abundance |
|--------------------------------------------|----------------------------------------------------------------------------------------|-----------------|-------------|-------------|------------------------------|
| Bendsten 2018 [12]                         | High-dairy diet: 1649 kcal, 21% P, 47% C, 31% F, 20 g fibre                           | 6.6 (1.3)       | ↔ Shannon   | ↔ UniFrac   | ↔                            |
| Low-dairy diet: 1585 kcal, 19% P, 46% C, 32% F, 22 g fibre | 7.9 (1.5) | ↔ Shannon | ↔ UniFrac | ↓ Veillonella |
| Benítez-Páez 2021 [13]                     | Calorie-restricted diet + fibre: 1642 kcal, 21% P, 47% C, 31% F, 18 g fibre           | 6.1 (NR)        | ↔ Simpson   | ↔ B–C       | NR                           |
| Calorie-restricted diet + placebo: 1730 kcal, 21% P, 46% C, 32% F, 18 g fibre | 5.5 (NR) | ↔ Simpson | ↔ B–C | NR |
| Cuevas-Sierra 2021 [14]                    | Moderately high-protein diet: M: 33% P, 50% C, 17% F, 25% P, 49% C, 17% F          | M: 10.3 (NR)    | M: ↔ Shannon | M: ↔ B–C   | ↑ Granulicatella             |
|                                           | F: 8.9 (NR)                                                                             | F: ↔ Shannon    | F: ↔ B–C   | ↓ Phascolactobacterium, Dielma |
| Low-fat diet: M: 25% P, 61% C, 14% FF, 24% P, 63% C, 13% F | M: 11.0 (NR) | M: ↑ Shannon | M: ↑↓ B–C | ↔ |
|                                           | F: 8.6 (NR)                                                                             | F: ↔ Shannon    | F: ↔ B–C | ↔ |
| Dhakal 2020 [15]                           | Retail weight reduction program: 1818 kcal, 24% P, 58% C, 38% F, 18 g fibre           | 10.2 (NR)       | ↑ OTU richness | NR | ↑ Tenericutes, Euryarchaeota |
|                                           |                                                                                       | ↔ Shannon       | ↑ Aitchison  | ↑ Akkermansia, Bifidobacterium |
| Dong 2020 [16]                             | High-protein diet: NR                                                                  | 3.5 (NR)        | ↑ Shannon    | ↑ Akkermansia, Bifidobacterium |
|                                           | Normal-protein diet: NR                                                                | 2.8 (NR)        | ↔ Shannon    | ↓ Prevotella, Arabinobacterium |
| Duncan 2008 [17]                           | High-protein, moderate-carbohydrate, non-ketogenic diet: NR                            | 4.6 (NR)        | NR          | NR          | ↑ Clostridium coccoides-related bacteria (other than Roseburia + Eubacterium rectale) |
|                                           |                                                                                       |                 |             |             | ↓ Total bacterial number, Roseburia + Eubacterium rectale, Bifidobacterium |
| Fragiadakis 2020 [18]                      | Low-carbohydrate diet: 426 kcal/d deficit, 22% P, 32% C, 45% F, 18 g fibre           | 5.1 (6.7)       | ↔ Observed ASVs | 3 months: ↓ B–C | 12 m: ↔ |
|                                           |                                                                                       |                 |             |             | 3 m: ↑ Bacteroidetes, Bacteroides, Parabacteroides, Sutterella, Bilophila, Desulfovibrio, Butyricimonas, Lachnobacter, Oscillospira |
| Fragiadakis 2020 [18]                      | Low-fat diet: 484 kcal/d deficit, 21% P, 48% C, 29% F, 20 g fibre                    | 5.6 (5.7)       | ↔ Observed ASVs | 3 months: ↔ B–C | 12 m: ↔ |
|                                           |                                                                                       |                 |             |             | 3 m: ↑ Bacteroidetes, Bacteroides, Parabacteroides |
|                                           |                                                                                       |                 |             |             | 3 m: ↓ Actinobacteria, Firmicutes, Bifidobacterium, Dorea, Blautia, Ruminococcus |
|                                           |                                                                                       |                 |             |             | 12 m: ↔ |
Table 2. Cont.

| Trial                          | Reported Dietary Intake                                                                 | Weight Loss, kg | α-Diversity | β-Diversity           | Relative Bacterial Abundance                                      |
|-------------------------------|----------------------------------------------------------------------------------------|-----------------|-------------|-----------------------|------------------------------------------------------------------|
| Gutiérrez-Repiso 2021 [20]    | Mediterranean diet: NR                                                                  | 7.8 (1.9)       | ↑ Observed ASVs | ↑ Shannon ↑ Faith ↑ Pielou | ↑ Faecalibacterium                                                |
|                               |                                                                                       |                 |             |                       |                     |
| Jaagura 2021 [21]             | Low-carbohydrate, high-fat weight loss diet: 25% P, 23% C, 50% F, 12 g fibre/1000 kcal | 7.7 (2.5)       | ↔ Observed species ↔ Shannon | ↓ B–C               | ↑ Alitripes, Butyrivibio, Odoribacter, Ruminococcus_1 ↓ Bifidobacterium, Collinsella, Dorea |
|                               |                                                                                       |                 |             |                       |                     |
| Johnstone 2020 [22]           | Weight loss diet: 1930 kcal, 29% P, 40% C, 30% F, 10% SFA, 25 g fibre, 15 g insoluble fibre, 5 g soluble fibre, 7 g resistant starch | 2.8 (NR)       | ↔ Chao1 ↔ Shannon | NR                   | ↔                                                                |
|                               |                                                                                       |                 |             |                       |                     |
| Kahleova 2020 [23]            | Low-fat vegan diet: 1294 kcal, 43 g P (13%), 236 g C (73%), 24.3 g F (17%), 33 g fibre, 9 g soluble fibre, 25 g insoluble fibre | 6.4 (NR)       | ↔ AWPD      | NR                   | ↑ Faecalibacterium ↓ Proteobacteria ↔ Bacteroidetes:Firmicutes, butyrate producing bacteria |
|                               |                                                                                       |                 |             |                       |                     |
| Kahleova 2021 [24]            | Low-fat vegan diet: 1315 kcal, 12% P, 69% C, 17% F, 33 g fibre, 9 g soluble fibre, 24 g insoluble fibre | 6.0 (NR)       | ↓ AWPD      | NR                   | ↑ Eubacteria ↓ Bacteroidetes, Proteobacteria ↔ Bacteroidetes:Firmicutes, butyrate-producing bacteria |
|                               |                                                                                       |                 |             |                       |                     |
| Ley 2006 [7]                  | Fat-restricted diet: NR                                                                | 15.4 (NR)       | ↔ Shannon   | NR                   | ↑ Bacteroidetes ↓ Firmicutes                                     |
|                               | Carbohydrate-restricted diet: NR                                                       | 8.0 (NR)        | ↔ Shannon   | NR                   | ↑ Bacteroidetes ↓ Firmicutes                                     |
|                               |                                                                                       |                 |             |                       |                     |
| Ma 2021 [25]                  | Low-carbohydrate diet: 1195 kcal, 26% P, 36% C, 38% F, 10 g fibre                   | 5.3 (NR)        | ↔ Shannon   | ↓ B–C               | ↑ Bacteroidetes:Firmicutes                                       |
|                               | Calorie-restricted diet: 1355 kcal, 18% P, 51% C, 31% F, 11 g fibre                  | 5.1 (NR)        | ↔ Shannon   | ↔ B–C               | ↔ Bacteroidetes:Firmicutes                                       |
|                               |                                                                                       |                 |             |                       |                     |
| Nogacka 2021 [26]             | Hypocaloric diet                                                                       | Group 1: <5% BW (n = 5) Group 2: >5% BW (n = 4) | Group 2 vs. total at baseline: ↔ Chao1 ↔ Shannon | NR                   | Group 2 vs. total at baseline: ↑ Clostridium sensu stricto 1 ↓ Parabacteroides |

Group 1: <5% BW (n = 5) Group 2: >5% BW (n = 4)
Table 2. Cont.

| Trial                | Reported Dietary Intake                          | Weight Loss, kg | α-Diversity | β-Diversity | Relative Bacterial Abundance |
|----------------------|-------------------------------------------------|----------------|-------------|-------------|-----------------------------|
| Pisanu 2020 [27]     | Mediterranean diet: 1341 kcal, 19% P, 50% C, 29% F, 17 g fibre | 6.7 (NR)       | ↔ Shannon   | ↑↓ B–C     | ↑ Catenibacterium, Caldilinon, Parabacteroides, Sphingobacterium, Veillonella |
|                      |                                                  |                |             |            | ↓ Proteobacteria, Megamonas, Roseburia, Ruminococcus, Streplococcus, Sutterella |
|                      |                                                  |                |             |            | ↔ Bacteroidetes:Firmicutes   |
| Stanislawski 2021 [28] | Energy-restricted diet: 1276 kcal, 21% P, 42% C, 35% F | 5.8 (3.8)      | ↑ Observed OTUs | ↑ Evenness ↑ Shannon ↑ Faith | ↑↓ UniFrac |
|                      |                                                  |                |             |            | ↑ Parabacteroides, Alistipes, Bacteroides |
|                      |                                                  |                |             |            | ↓ Subdoligranulum, Collinsella |
| Zhang 2021 [29]      | Low-carbohydrate diet: 1470 kcal, 34% P, 16% C, 50% F | 2.2 (1.2) kg/m² | ↔ Shannon   | ↔ B–C     | ↔ (phylum level)             |
|                      |                                                  |                | ↔ Simpson   |           |                            |
|                      |                                                  |                | ↔ Richness (genus level) |           |                            |

% p: percent of energy from protein, % C: percent of energy from carbohydrates, % F: percent of energy from fat, M: males, F: females, BW: body weight, NR: not reported, ↑: increase, ↓: decrease, ↔: no change, ↑↓: direction of change not reported, AWPD: abundance-weighted phylogenetic diversity measure, B–C: Bray–Curtis dissimilarity. Weight loss reported as mean (SD).
Table 3. Changes in faecal short-chain fatty acid concentrations.

| Trial | Reported Dietary Intake                                                                 | Weight Loss, kg | Total SCFAs | Butyrate   | Propionate | Acetate |
|-------|----------------------------------------------------------------------------------------|-----------------|-------------|------------|------------|---------|
|       |                                                                                       |                 | ↔ ↔ ↔ ↔     | ↔ ↔ ↔ ↔     | ↔ ↔ ↔ ↔   | ↔ ↔ ↔   |
| Benítez-Páez 2021 [13] | Calorie-restricted diet + fibre: 1642 kcal, 21% P, 47% C, 31% F, 18 g fibre | 6.1 (NR)        | NR          | ↔ ↔ ↔ ↔     | ↔ ↔ ↔ ↔   | ↔ ↔ ↔   |
|       | Calorie-restricted diet + placebo: 1730 kcal, 21% P, 46% C, 32% F, 18 g fibre         | 5.5 (NR)        | NR          | ↔ ↔ ↔ ↔     | ↔ ↔ ↔ ↔   | ↔ ↔ ↔   |
| Gratz 2019 [19] | Normal-protein weight loss diet: 2154 kcal, 80 g P (15%), 309 g C (57%), 73 g F (31%), 29 g fibre | 3.9 (NR)        | ↔ ↔ ↔ ↔     | ↔ ↔ ↔ ↔     | ↔ ↔ ↔ ↔   | ↔ ↔ ↔   |
|       | Normal-protein weight loss diet enriched with free amino acids and moderate amounts of carbohydrate: 2143 kcal, 156 g P (29%), 219 g C (41%), 73 g F (31%), 20 g fibre | 4.3 (NR)        | ↔ ↔ ↔ ↔     | ↔ ↔ ↔ ↔     | ↔ ↔ ↔ ↔   | ↔ ↔ ↔   |
|       | High-protein weight loss diet containing moderate amounts of carbohydrate: 2106 kcal, 156 g P (29%), 219 g C (42%), 72 g F (31%), 18 g fibre | 4.0 (NR)        | ↔ ↔ ↓ ↔     | ↔ ↔ ↔ ↔     | ↔ ↔ ↔ ↔   | ↔ ↔ ↔   |
| Johnstone 2020 [22] | Weight loss diet: 1930 kcal, 29% P, 40% C, 30% F, 10% SFA, 25 g fibre, 15 g insoluble fibre, 5 g soluble fibre, 7 g resistant starch | 2.8 (NR)        | NR          | ↔ (% of total SCFA) | ↔ (% of total SCFA) | ↔ (% of total SCFA) |
| Nogacka 2021 [26] | Hypocaloric diet: NR                                                                    |                 | ↔ ↔ ↔ ↔     | ↔ ↔ ↔ ↔     | ↔ ↔ ↔ ↔   | ↔ ↔ ↔   |

% p: percent of energy from protein, % C: percent of energy from carbohydrates, % F: percent of energy from fat, NR: not reported, ↓: decrease, ↔: no change.
3.7. Changes in Relative Bacterial Abundance

Changes in relative bacterial abundance were assessed by 23 (82%) interventions. For the purpose of this review, we focused on changes at the taxonomic levels of phylum and genus only. Significant changes are shown in Table 2.

There were significant changes in six phyla across eight different interventions. Changes in the relative abundance of Bacteroidetes was inconsistent, increasing after a year-long fat-restricted diet and carbohydrate-restricted diet [7] and decreasing following a 16-week vegan diet [24]. Bacteroidetes also increased at 3 months of a low-fat diet and low-carbohydrate diet but returned to baseline levels by 12 months [18]. Three interventions reported a decrease in Firmicutes [7,15], with one reporting a decrease at 3 months, but not after 12 months [18]. The relative abundance of Proteobacteria decreased following two 16-week vegan diets [23,24] and a 3-month Mediterranean diet [27]. The ratio of Bacteroidetes to Firmicutes was unchanged in four interventions [23–25,27] and increased following a 12-week low-carbohydrate diet [25], but not reported in the majority of studies.

There were significant changes in 32 genera across 14 different interventions. The majority of genera only changed in one or two interventions, while changes in the other genera were inconsistent between studies. Bifidobacterium increased following two interventions (a normal-protein diet and a high-protein diet [16]) and decreased following two interventions (a high-protein, moderate-carbohydrate, non-ketogenic diet [17] and a low-carbohydrate, high-fat diet [21]). Parabacteroides increased following two interventions [27,28] and decreased in a third [26]. Another study found changes in Bifidobacterium and Parabacteroides abundance at 3 months, but these had returned to baseline levels by 12 months [18].

3.8. Changes in Faecal SCFAs

Seven interventions (25%) measured changes in faecal SCFA concentrations (Table 3). Concentrations were unaffected by all but one intervention in which butyrate concentration, but not total SCFA concentration, decreased [19].

3.9. Risk of Bias

RoB assessment for the 19 included studies is presented in Figure S1. Sequence generation was unclear in seven of the 14 trials that were randomised and only one trial adequately described the method of allocation concealment. RoB due to lack of blinding of participants/personnel and outcome assessors was deemed to be low in all studies, as lack of blinding is unlikely to affect microbiota-related outcomes or measurement of such. RoB due to incomplete outcome data was also rated as low in all studies as missing microbiota-related data are unlikely to be related to the true outcome. No studies had published protocols pre-specifying methods of microbiota analysis; as such, selective outcome reporting was unclear. All studies were deemed free from other sources of bias.

4. Discussion

The obese state has been associated with an altered gut microbiota, generating interest in the potential of weight loss to modulate the microbiota. This review found that dietary weight loss interventions had limited effect on bacterial diversity and faecal SCFA concentrations. Changes in bacterial abundance at the phylum and genus level were inconsistent across studies and there was no obvious correlation between macronutrient composition and microbiota outcomes.

The minimal effect of food-based weight loss interventions on α-diversity of the gut microbiota is consistent with other literature. A recent systematic review and meta-analysis of food-based, formula-based, and surgical weight loss interventions found a positive dose–response relationship between weight loss and α-diversity [30]. Food-based dietary interventions on their own, however, had an inconsistent effect on α-diversity, with no statistically significant effect when results were pooled [30]. It is likely that the degree of weight loss achieved through food-based weight loss is not large enough to produce the statistically significant change in α-diversity seen within very-low-calorie formula-
based diets (VLCD) and with surgical interventions, both of which were excluded from this review.

In addition, microbiota metrics were not typically the primary outcome in the studies included in this review. The weight loss interventions reported power calculations based on detecting significance in weight loss rather than microbiota changes. Given the large interindividual variability in the gut microbiota, much larger sample sizes would be needed to detect significant changes following diet-induced weight loss.

Low fibre intake in the included studies may also explain the lack of consistent effect on the gut microbiota. In studies that reported fibre intake, this ranged from 10 to 33 g per day. Fibre is the main substrate for bacterial fermentation and observational studies of rural African tribes indicate that high-fibre diets are associated with greater bacterial diversity and SCFA production [31,32]. These tribes consume upwards of 100 g of fibre per day and similarly high levels may be needed to induce microbiota changes in interventional studies, which is unlikely to be feasible without the use of supplements. The diversity of plant foods consumed is also important, with the American Gut Project finding microbial diversity to be associated with the number of unique plant foods consumed each week rather than self-reported categories such as “vegan” or “omnivore” [33]. Low dietary diversity may explain the unchanged or decreased bacterial diversity seen in the two vegan dietary interventions included in this review. Richer and more robust dietary reporting methods, including details on soluble/insoluble fibre intake as well as the type and diversity of plant foods consumed, are needed to better understand the relationship between diet and the microbiota [34].

The finding that dietary weight loss strategies have a limited effect on microbiota-related outcomes is surprising considering previous research showing that 4 days of a completely animal- or plant-based diet rapidly alters gut microbial communities [35]. This suggests that drastic dietary changes are needed to observe an effect. It may also be that the microbiota is resistant to long-term changes [36]. Indeed, a study included in this review observed changes in relative bacterial abundance at 3 months, but these were ameliorated by 6 months despite continued dietary adherence [18]. Long-term studies with frequent microbiota measurements are required to examine the resilience of the microbiota to dietary changes. Differences in baseline microbiota characteristics may also explain inconsistencies across studies, with baseline microbial diversity and gene richness associated with individualized gut microbiota responses [37–39].

Gut bacteria produce a wide range of metabolites that have been implicated in health outcomes [40]. SCFAs are among the most commonly measured metabolites in microbiome studies; as such, we limited our review to these metabolites only. Only four studies (21%) meeting inclusion criteria analysed faecal SCFA concentrations, which were mostly unchanged following dietary intervention. Further studies assessing the effect of food-based weight loss interventions on SCFAs, as well as other microbiota-derived metabolites such as trimethylamine N-oxide, secondary bile acids, and tryptophan metabolites, are needed to facilitate a meta-analysis.

Differences in study design, population, and methodology limit the conclusions that can be drawn from this review. While we aimed to exclude studies involving participants with comorbidities such as metabolic syndrome, presence of comorbidities was not always described in the included studies. Differences in age, sex, geographic location, and inclusion/exclusion criteria may also represent confounding factors. Several different molecular biology techniques (16S rRNA amplicon sequencing, shotgun metagenomic sequencing, FISH, qPCR) were used to assess the gut microbial composition. Differences in the 16S rRNA gene region amplified and OTU picking protocols and databases may also explain differing results [41]. A wide range of metrics were used to assess α-diversity (e.g., Shannon index, Pielou index, Chao1 index) and β-diversity (e.g., Bray–Curtis dissimilarity, Aitchison distance, weighted and unweighted UniFrac distances), making a meta-analysis not possible. Many studies reported relative changes (e.g., an increase in diversity or decrease in a particular taxa) rather than absolute value changes, further limiting
our ability to conduct a meta-analysis. Reporting absolute percentage changes in relative bacterial abundance, as per Kahleova et al. [24], would facilitate quantitative comparison between studies. Due to the lack of species-level sensitivity of 16S rRNA-based techniques, we were only able to compare changes at the genus level. Further research utilizing whole-genome sequencing is needed to evaluate the effect of dietary interventions on individual species. Reporting of baseline dietary intake and microbiota composition is also needed to evaluate whether changes are observed only in participants who drastically alter their diet or in those with low bacterial gene richness or lacking certain taxa to begin with.

5. Conclusions

There were minimal changes in bacterial diversity and faecal SCFA concentrations following dietary weight loss interventions, with inconsistent changes in relative bacterial abundance at the phylum and genus level. Further studies, adequately powered to detect changes in microbiota-related outcomes, are needed. Greater consistency in the method of microbiota analysis and α- and β-diversity metrics, as well as reporting of absolute changes in these variables, is needed if a meta-analysis is to be conducted.

Supplementary Materials: The following supporting information can be downloaded at: https://www.mdpi.com/article/10.3390/nu14091953/s1, Table S1: Search strategy, Table S2: Reasons for excluding studies following full-text assessment, Figure S1: Risk-of-bias assessment. References [13,26,38,42–98] are cited in the supplementary materials.

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References
1. Obesity and Overweight. Available online: https://www.who.int/news-room/fact-sheets/detail/obesity-and-overweight (accessed on 1 March 2022).
2. Pi-Sunyer, F.X. The obesity epidemic: Pathophysiology and consequences of obesity. Obes. Res. 2002, 10, 97S–104S. [CrossRef] [PubMed]
3. Withrow, D.; Alter, D.A. The economic burden of obesity worldwide: A systematic review of the direct costs of obesity. Obes. Rev. 2011, 12, 131–141. [CrossRef] [PubMed]
4. Thaker, V.V. Genetic and epigenetic causes of obesity. Adolesc. Med. State Art Rev. 2017, 28, 379. [CrossRef] [PubMed]
5. Valdes, A.M.; Walter, J.; Segal, E.; Spector, T.D. Role of the gut microbiota in nutrition and health. BMJ 2018, 361, k2179. [CrossRef] [PubMed]
6. Wang, B.; Yao, M.; Lv, L.; Ling, Z.; Li, L. The human microbiota in health and disease. Engineering 2017, 3, 71-82. [CrossRef]
7. Ley, R.E.; Turnbaugh, P.J.; Klein, S.; Gordon, J.I. Human gut microbes associated with obesity. Nature 2006, 444, 1022–1023. [CrossRef]
8. Ridaura, V.K.; Faith, J.J.; Rey, F.E.; Cheng, J.; Duncan, A.E.; Kau, A.L.; Griffin, N.W.; Lombard, V.; Henrissat, B.; Bain, J.R. Gut microbiota from twins discordant for obesity modulate metabolism in mice. Science 2013, 341, 1241214. [CrossRef]
9. Johnston, B.C.; Kanters, S.; Bandayrel, K.; Wu, P.; Naji, F.; Siemieniuk, R.A.; Ball, G.D.; Busse, J.W.; Thorlund, K.; Guyatt, G. Comparison of weight loss among named diet programs in overweight and obese adults: A meta-analysis. JAMA 2014, 312, 923–933. [CrossRef]
10. Christiansen, T.; Bruun, J.M.; Madsen, E.L.; Richelsen, B. Weight loss maintenance in severely obese adults after an intensive lifestyle intervention: 2-to 4-year follow-up. Obesity 2007, 15, 413–420. [CrossRef]
11. Higgins, J.P.T.; Altman, D.G.; Gotzsche, P.C.; Jønsson, I.; Moher, D.; Oxman, A.D.; Savović, J.; Schulz, K.F.; Weeks, L.; Sterne, J.A.C. The Cochrane Collaboration’s tool for assessing risk of bias in randomised trials. BMJ 2011, 343, d5928. [CrossRef]

12. Bendtsen, L.Q.; Bladsgaard, T.; Holt, J.B.; Lorenzen, J.K.; Mark, A.B.; Kærlerich, P.; Kristiansen, K.; Astrup, A.; Larsen, L.H. High intake of dairy during energy restriction does not affect energy balance or the intestinal microflora compared with low dairy intake in overweight individuals in a randomized controlled trial. Appl. Physiol. Nutr. Metab. 2018, 43, 1–10. [CrossRef] [PubMed]

13. Benítez-Páez, A.; Hess, A.L.; Krauthammer, S.; Liebisch, G.; Christensen, L.; Hjorth, M.F.; Larsen, T.M.; Sanz, Y. Sex, Food, and the Gut Microbiota: Disparate Response to Caloric Restriction Diet with Fiber Supplementation in Women and Men. Mol. Nutr. Food Res. 2021, 65, e2000996. [CrossRef] [PubMed]

14. Cuevas-Sierra, A.; Romo-Hualde, A.; Aranaz, P.; Goni, L.; Cuervo, M.; Martínez, J.A.; Milagro, F.I.; Riezu-Boj, J.I. Diet- and sex-related changes of gut microbiota composition and functional profiles after 4 months of weight loss intervention. Eur. J. Nutr. 2021, 60, 3279–3301. [CrossRef] [PubMed]

15. Dhakal, S.; McCormack, L.; Dey, M. Association of the Gut Microbiota with Weight-Loss Response within a Retail Weight-Management Program. Microorganisms 2020, 8, 1246. [CrossRef] [PubMed]

16. Dong, T.S.; Luu, K.; Lagishetty, V.; Sedighian, F.; Woo, S.L.; Dreskin, B.W.; Katzka, W.; Chang, C.; Zhou, Y.; Arias-Jayo, N.; et al. A High Protein Calorie Restriction Diet Alters the Gut Microbiome in Obesity. Nutrients 2020, 12, 3221. [CrossRef]

17. Duncan, S.H.; Lobley, G.E.; Holtrop, G.; Ince, J.; Johnstone, A.M.; Louis, P.; Flint, H.J. Human colonic microbiota associated with diet, obesity and weight loss. Int. J. Obes. 2008, 32, 1720–1724. [CrossRef]

18. Fragiadakis, G.K.; Wastyk, H.C.; Robinson, J.L.; Sonnenburg, E.D.; Sonnenburg, J.L.; Gardner, C.D. Long-term dietary intervention reveals resilience of the gut microbiota changes in diet and weight. Am. J. Clin. Nutr. 2020, 111, 1127–1136. [CrossRef]

19. Gratz, S.W.; Hazim, S.; Richardson, A.J.; Scobbie, L.; Johnstone, A.M.; Lobley, G.E.; Holubkov, R.; Lobley, G.E.; Russell, W.R. Dietary carbohydrate rather than protein intake drives colonic microbial fermentation during weight loss. Eur. J. Nutr. 2019, 58, 1147–1158. [CrossRef]

20. Gutiérrez-Repiso, C.; Molina-Vega, M.; Bernal-López, M.R.; Garrido-Sánchez, L.; García-Almeida, J.M.; Sajoux, I.; Moreno-Indias, I.; Tinahones, F.J. Different Weight Loss Intervention Approaches Reveal a Lack of a Common Pattern of Gut Microbiota Changes. J. Pers. Med. 2021, 11, 109. [CrossRef]

21. Jaagura, M.; Viardi, E.; Karu-Lavits, K.; Adamberg, K. Low-carbohydrate high-fat weight reduction diet induces changes in human gut microbiota. Microbiol.gologpen 2020, 10, e1194. [CrossRef]

22. Johnstone, A.M.; Kelly, J.; Ryan, S.; Romero-Gonzalez, R.; McKinnon, H.; Fyfe, C.; Holtrop, G.; Lobley, G.E.; Russell, W.R. Dietary carbohydrate rather than protein intake drives colonic microbial fermentation during weight loss. Eur. J. Nutr. 2021, 58, 1147–1158. [CrossRef]

23. Kahleova, H.; Rembert, E.; Alwarith, J.; Yonas, W.N.; Tura, A.; Holubkov, R.; Chutkan, R.; Barnard, N.D. Effects of a Moderately Hypocaloric Mediterranean Diet on the Gut Microbiota Composition of Italian Obese Patients. Mol. Nutr. Food Res. 2021, 65, e2000030. [CrossRef]

24. Koutoukidis, D.A.; Jubb, S.A.; Zimmerman, M.; Otunla, A.; Henry, J.A.; Ferrey, A.; Schofield, E.; Kinton, J.; Aveyard, P.; Marchesi, J.R. The association of weight loss with changes in the gut microbiota diversity, composition, and intestinal permeability: A systematic review and meta-analysis. Gut Microbes 2022, 14, 2020068. [CrossRef]

25. Schnorr, S.L.; Candela, M.; Rampelli, S.; Centanni, M.; Consolandi, C.; Basaglia, G.; Turroni, S.; Biagi, E.; Peano, C.; Severgnini, M.; et al. Gut microbiome of the Hadza hunter-gatherers. Nat. Commun. 2014, 5, 3654. [CrossRef]

26. De Filippis, C.; Cavalieri, D.; Di Paola, M.; Ramazzotti, M.; Poulet, J.B.; Massart, S.; Collini, S.; Pieraccini, G.; Lionetti, P. Impact of diet in shaping gut microbiota revealed by a comparative study in children from Europe and rural Africa. Proc. Natl. Acad. Sci. USA 2010, 107, 14691–14696. [CrossRef] [PubMed]
40. Agus, A.; Cl 38. Salonen, A.; Lahti, L.; Salojärvi, J.; Holtrop, G.; Korpela, K.; Duncan, S.H.; Date, P .; Farquharson, F.; Johnstone, A.M.; Lob- 51. Dong, T.S.; Luu, K.; Lagishetty, V .; Sedighian, F.; Woo, S.L.; Dreskin, B.W.; Katzka, W.; Chang, C.; Zhou, Y.; Arias-Jayo, N.; et al. 52. Duncan, S.H.; Belenguer, A.; Holtrop, G.; Johnstone, A.M.; Flint, H.J.; Lobley, G.E. Reduced dietary intake of carbohydrates by 44. Basciani, S.; Camajani, E.; Contini, S.; Persichetti, A.; Risi, R.; Bertoldi, L.; Strigari, L.; Prossomariti, G.; Watan- 47. Damms-Machado, A.; Mitra, S.; Schollenberger, A.E.; Kramer, K.M.; Meile, T.; Königsrainer, A.; Huson, D.H.; Bischoff, S.C. Effects 42. Alem 41. Koren, O.; Knights, D.; Gonzalez, A.; Waldron, L.; Segata, N.; Knight, R.; Huttenhower, C.; Ley, R.E. A Guide to Enterotypes 36. Sommer, F.; Anderson, J.M.; Bharti, R.; Raes, J.; Rosenstiel, P. The resilience of the intestinal microbiota influences health and 35. David, L.A.; Maurice, C.F.; Carmody, R.N.; Gootenberg, D.B.; Button, J.E.; Wolfe, B.E.; Ling, A.V.; Devlin, A.S.; Varma, Y.; Fischbach, M.A.; et al. Diet rapidly and reproducibly alters the human gut microbiome. Nature 2014, 505, 559–563. [CrossRef] [PubMed] 36. McDonald, D.; Hyde, E.; Debelsius, J.W.; Morton, J.T.; Gonzalez, A.; Ackermann, G.; Aksenov, A.A.; Behsaz, B.; Brennan, C.; Chen, Y.; et al. American Gut: An Open Platform for Citizen Science Microbiome Research. mSystems 2018, 3, e00031-18. [CrossRef] [PubMed] 34. Johnson, A.J.; Vangay, P.; Al-Ghalith, G.A.; Hillmann, B.M.; Ward, T.L.; Shields-Cutler, R.R.; Kim, A.D.; Shmagel, A.K.; Syed, A.N.; Walter, J.; et al. Daily Sampling Reveals Personalized Diet-Microbiome Associations in Humans. Cell Host Microbe 2019, 25, 789–802.e785. [CrossRef] 35. David, L.A.; Maurice, C.F.; Carmody, R.N.; Gootenberg, D.B.; Button, J.E.; Wolfe, B.E.; Ling, A.V.; Devlin, A.S.; Varma, Y.; Fischbach, M.A.; et al. Diet rapidly and reproducibly alters the human gut microbiome. Nature 2014, 505, 559–563. [CrossRef] [PubMed] 36. Sommer, F.; Anderson, J.M.; Bharti, R.; Raes, J.; Rosenstiel, P. The resilience of the intestinal microbiota influences health and disease. Nat. Rev. Microbiol. 2017, 15, 630–638. [CrossRef] [PubMed] 37. Tap, J.; Furet, J.P.; Bensaada, M.; Philippe, C.; Roth, H.; Rabot, S.; Lakhdari, O.; Lombard, V.; Henrissat, B.; Corthier, G.; et al. Gut microbiota richness promotes its stability upon increased dietary fibre intake in healthy adults. Environ. Microbiol. 2015, 17, 4954–4964. [CrossRef] 38. Salonen, A.; Lahti, L.; Salojärvi, J.; Holtrop, G.; Korpela, K.; Duncan, S.H.; Date, P.; Farquharson, F.; Johnstone, A.M.; Lobley, G.E.; et al. Impact of diet and individual variation on intestinal microbiota composition and fermentation products in obese men. ISME J. 2014, 8, 2218–2220. [CrossRef] 39. Cotillard, A.; Kennedy, S.P.; Kong, L.C.; Prifti, E.; Pons, N.; Le Chatelier, E.; Almeida, M.; Quinquis, B.; Levenez, F.; Galleron, N.; et al. Dietary intervention impact on gut microbial gene richness. Nature 2013, 500, 585–588. [CrossRef] 40. Agus, A.; Clément, K.; Sokol, H. Gut microbiota-derived metabolites as central regulators in metabolic disorders. Gut 2021, 70, 1174–1182. [CrossRef] 41. Koren, O.; Knights, D.; Gonzalez, A.; Waldron, L.; Segata, N.; Knight, R.; Huttenhower, C.; Ley, R.E. A Guide to Enterotypes across the Human Body: Meta-Analysis of Microbial Community Structures in Human Microbiome Datasets. PLoS Comput. Biol. 2013, 9, e1002863. [CrossRef] 42. Alemán, J.O.; Bokulich, N.A.; Swann, J.R.; Walker, J.M.; Rosa, J.C.; Battaglia, T.; Costabile, A.; Pechlivanis, A.; Liang, Y.; Breslow, J.L.; et al. Fecal microbiota and bile acid interactions with systemic and adipose tissue metabolism in diet-induced weight loss of obese postmenopausal women. J. Transl. Med. 2018, 16, 244. [CrossRef] [PubMed] 43. Allen, J.M.; Nehra, V.; Mailing, L.; Holscher, H.D.; Van Dyke, C.T.; Edens, K.; Swanson, K.S.; Boardman, L.A.; Jensen, M.D.; Murray, J.A.; et al. Gut microbiota: Predictor of success in a comprehensive of lifestyle modification program for obesity. Gastroenterology 2017, 152, S626–S627. [CrossRef] 44. Basciani, S.; Camajani, E.; Contini, S.; Persichetti, A.; Risi, R.; Bertoldi, L.; Strigari, L.; Prossomariti, G.; Watanabe, M.; Watanabe, S.; et al. Very-Low-Calorie Ketogenic Diets with Whey, Vegetable, or Animal Protein in Patients With Obesity: A Randomized Pilot Study. J. Clin. Endocrinol. Metab. 2020, 105, 2939–2949. [CrossRef] [PubMed] 45. Christensen, L.; Vuholm, S.; Roager, H.M.; Nielsen, D.S.; Krych, L.; Kristensen, M.; Astrup, A.; Hjorth, M.F. Prevotella Abundance Predicts Weight Loss Success in Healthy Adults Consuming a Whole-Grain Diet Ad Libitum: A Post Hoc Analysis of a 6-Wk Randomized Controlled Trial. J. Nutr. 2019, 149, 2174–2181. [CrossRef] 46. Cuevas Sierra, A.; Riezu Boj, J.; Guruceaga, E.; Barceló, A.; Cuervo, M.; Milagro, F.; Martinez, A. Metagenomic biomarker in precision treatment for obesity: Microbiota composition change between before and after a nutrition intervention. Obes. Rev. 2020, 21, e13115. [CrossRef] 47. Damms-Machado, A.; Mitra, S.; Schollenberger, A.E.; Kramer, K.M.; Meile, T.; Königsrainer, A.; Huson, D.H.; Bischoff, S.C. Effects of surgical and dietary weight loss therapy for obesity on gut microbiota composition and nutrient absorption. Biomed. Res. Int. 2015, 2015, 806248. [CrossRef] 48. Dao, M.C.; Sokolovska, N.; Brazellels, R.; Affeldt, S.; Pelloux, V.; Prifti, E.; Challoux, J.; Verger, E.O.; Kayser, B.D.; Aron-Wisnewsky, J.; et al. A Data Integration Multi-Omics Approach to Study Calorie Restriction-Induced Changes in Insulin Sensitivity. Front. Physiol. 2018, 9, 1958. [CrossRef] 49. Di Rosa, C.; Lattanzi, G.; Taylor, S.F.; Manfrini, S.; Khazrai, Y.M. Very low calorie ketogenic diets in overweight and obesity treatment: Effects on anthropometric body composition, body mass index, lipid profile and microbiota. Obes. Res. Clin. Pract. 2020, 14, 491–503. [CrossRef] 50. Diener, C.; Qin, S.; Zhou, Y.; Patwardhan, S.; Tang, L.; Lovejoy, J.C.; Magis, A.T.; Price, N.D.; Hood, L.; Gibbons, S.M. Baseline Gut Metagenomic Functional Gene Signature Associated with Variable Weight Loss Responses following a Healthy Lifestyle Intervention in Humans. mSystems 2021, 6, e00964-21. [CrossRef] 51. Dong, T.S.; Luu, K.; Lagishetty, V.; Sedighian, F.; Woo, S.L.; Dreskin, B.W.; Katzka, W.; Chang, C.; Zhou, Y.; Arias-Jayo, N.; et al. The Intestinal Microbiome Predicts Weight Loss on a Calorie-Restricted Diet and Is Associated With Improved Hepatic Steatosis. Front. Nutr. 2021, 8, 718661. [CrossRef] 52. Duncan, S.H.; Belenguer, A.; Holtrop, G.; Johnstone, A.M.; Flint, H.J.; Lobley, G.E. Reduced dietary intake of carbohydrates by obese subjects results in decreased concentrations of butyrate and butyrate-producing bacteria in feces. Appl. Environ. Microbiol. 2007, 73, 1073–1078. [CrossRef] [PubMed]
53. Fabian, C.J.; Kimler, B.F.; Umar, S.; Ahmed, I.; Befort, C.A.; Nydegger, J.L.; Kreutzjans, A.L.; Powers, K.R.; Klemp, J.R.; Spaeth, K.R.; et al. Changes in the gut microbiome of post-menopausal women 2 weeks after initiating a structured weight loss intervention. *Cancer Res.* 2017, 77, P4-13-03. [CrossRef]

54. Fangmann, D.; Heinsen, F.A.; Schulte, D.M.; Rühlemann, M.C.; Türk, K.; Settgast, U.; Müller, N.; Lieb, W.; Baines, J.F.; Schreiber, S.; et al. Dietary and weight loss effects on human gut microbiome diversity and metabolism. *Diabetol. Stoffwechs.* 2016, 11, P166. [CrossRef]

55. Gabel, K.; Marcell, J.; Carees, K.; Kalam, F.; Cienfuegos, S.; Ezpeleta, M.; Varady, K.A. Effect of time restricted feeding on the gut microbiome in adults with obesity: A pilot study. *Nutra. Health* 2020, 26, 79–85. [CrossRef]

56. Gardner, C.D.; Hauser, M.; Gobbo, L.D.; Trepanowski, J.; Rigdon, J.; Ioannidis, J.; King, A.; Desai, M. Neither insulin secretion nor genotype pattern modify 12-month weight loss effects of healthy low-fat vs. healthy low-carbohydrate diets among adults with obesity. *Circulation* 2017, 135. [CrossRef]

57. Gratz, S.W.; Scobie, L.; Richardson, A.J.; Zhang, X.; Fythe, C.; Farquharson, E.M.; Duncan, G.; Filipe, J.; Zhu, W.Y.; Johnstone, A.M.; et al. Comparison of meat versus soya based high-protein diets on faecal microbiota and microbial metabolites. *Proc. Nutr. Soc.* 2020, 79, E781. [CrossRef]

58. Grembi, J.A.; Nguyen, I.H.; Haggerty, T.D.; Gardner, C.D.; Holmes, S.P.; Parsonnet, J. Gut microbiota plasticity is correlated with sustained weight loss on a low-carb or low-fat dietary intervention. *Sci. Rep.* 2020, 10, 1405. [CrossRef]

59. Heianza, Y.; Ma, W.; Sun, D.; Smith, S.R.; Bray, G.A.; Sacks, F.M.; Qi, L. Changes in gut microbiota metabolites and successful weight-loss in response to weight-loss diets: The POUNDS lost trial. *Circulation* 2017, 136, A14459. [CrossRef]

60. Heianza, Y.; Sun, D.; Ma, W.; Zheng, Y.; Champagne, C.M.; Bray, G.A.; Sacks, F.M.; Qi, L. Gut-microbiome-related LCT genotype and 2-year changes in body composition and fat distribution: The POUNDS Lost Trial. *Int. J. Obes.* 2018, 42, 1565–1573. [CrossRef]

61. Heinsen, F.A.; Fangmann, D.; Müller, N.; Schulte, D.M.; Rühlemann, M.C.; Türk, K.; Settgast, U.; Lieb, W.; Baines, J.F.; Schreiber, S.; et al. Beneficial Effects of a Dietary Weight Loss Intervention on Human Gut Microbiome Diversity and Metabolism Are Not Sustained during Weight Maintenance. *Obes. Facts* 2016, 9, 379–391. [CrossRef] [PubMed]

62. Henning, S.M.; Yang, J.; Woo, S.L.; Lee, R.P.; Huang, J.; Rasmussen, A.; Carpenter, C.L.; Thames, G.; Gilbuena, I.; Tseng, C.H.; et al. Hass Avocado Inclusion in a Weight-Loss Diet Supported Weight Loss and Altered Gut Microbiota: A 12-Week Randomized, Parallel-Controlled Trial. *Curr. Dev. Nutr.* 2019, 3, ezz068. [CrossRef] [PubMed]

63. Hjorth, M.F.; Blædel, T.; Bendtsen, L.Q.; Lorenzen, J.K.; Holm, J.B.; Kiilerich, P.; Roager, H.M.; Kristiansen, K.; Larsen, L.H.; Astrup, A. Pretreatment Prevotella-to-Bacteroides ratio predicts body weight and fat loss success on 24-week diets varying in macronutrient composition and dietary fiber: Results from a post-hoc analysis. *Int. J. Obes.* 2019, 43, 149–157. [CrossRef] [PubMed]

64. Hjorth, M.F.; Christensen, L.; Larsen, T.M.; Roager, H.M.; Krych, L.; Kot, W.; Nielsen, D.S.; Ritz, C.; Astrup, A. Pretreatment Prevotella-to-Bacteroides ratio and salivary amylase gene copy number as prognostic markers for dietary weight loss. *Am. J. Clin. Nutr.* 2020, 111, 1079–1086. [CrossRef]

65. Holt, P.R.; Aleman, J.O.; Bokulich, N.A.; Swann, J.R.; Dannenberg, A.J.; Blaser, M.J.; Hudis, C.A.; Breslow, J. Vld-induced rapid weight loss is accompanied by enhanced lipolysis, altered adipose tissues with concomitant changes in the fecal microbiome and plasma metabolome. *Gastroenterology* 2016, 150, S9. [CrossRef]

66. Hric, I.; Ugrayová, S.; Pesenová, A.; Rádkiová, Ž.; Kubáňová, L.; Šardziková, S.; Baranovičová, E.; Klučar, L.; Beke, G.; Grendar, M.; et al. The Efficacy of Short-Term Weight Loss Programs and Consumption of Natural Probiotic Bryndza Cheese on Gut Microbiota Composition in Women. *Nutrients* 2021, 13, 1753. [CrossRef]

67. Jie, Z.; Yu, X.; Liu, Y.; Sun, L.; Chen, P.; Ding, Q.; Gao, Y.; Zhang, X.; Yu, M.; Liu, Y.; et al. The Baseline Gut Microbiota Directs Dieting-Induced Weight Loss Trajectories. *Gastroenterology* 2016, 160, 2029–2042.e2016. [CrossRef]

68. Karl, J.P.; Xueyan, F.; Xiaowin, W.; Yufeng, Z.; Jian, S.; Chenhong, Z.; Wolfe, B.E.; Saltzman, E.; Liping, Z.; Booth, S.L. Fecal menaquinone profiles of overweight adults are associated with gut microbiota composition during a gut microbiota-targeted dietary intervention. *Am. J. Clin. Nutr.* 2015, 102, 84–93. [CrossRef]

69. Kayser, B.D.; Prifti, E.; Lhomme, M.; Belda, E.; Dac, M.C.; Aron-Wisnewsky, J.; Kontush, A.; Zucker, J.D.; Rizkalla, S.W.; Dugail, I.; et al. Elevated serum ceramides are linked with obesity-associated gut dysbiosis and impaired glucose metabolism. *Metabolomics* 2019, 15, 140. [CrossRef]

70. Kong, L.; Wuillemin, P.; Hajduc, F.; Bastard, J.; Fellahi, S.; Basdevant, A.; Zucker, J.; Doré, J.; Rizkalla, S.; Clément, K. Insulinemia and inflammatory markers might predict different responses of obese subjects under the same hypocaloric diet intervention. *Ann. Nutr. Metab.* 2011, 58, 75–76. [CrossRef]

71. Kong, L.C.; Hajduch, F.; Wuillemin, P.H.; Bastard, J.P.; Fellahi, S.; Bonnefont-Rousselot, D.; Bittar, R.; Basdevant, A.; Zucker, J.D.; Doré, J.; et al. Plasma insulin and inflammatory markers prior to weight loss can predict dietary responders. *Diabetes* 2011, 60, A517. [CrossRef]

72. Lee, C.; Florea, L.; Potter, J.; Sears, C.; Durkin, N.; Scudder, M.; Maruthur, N.M.; Schweitzer, M.; Magnuson, T.; Steele, K.; et al. Changes in gut microbiome after medical vs. surgical weight loss in a randomized trial. *Diabetes* 2016, 65, A508. [CrossRef]

73. Li, X.; Sun, D.; Zhou, T.; Heianza, Y.; Bray, G.; Sacks, F.; Qi, L. Changes in Gut microbiota metabolite TMAO are related to changes in hepatic and visceral fat in weight-loss diet interventions: The POUNDS Lost trial. *Circulation* 2019, 139. [CrossRef]

74. Lin, B.Y.; Lin, W.D.; Huang, C.K.; Hsin, M.C.; Lin, W.Y.; Pryor, A.D. Changes of gut microbiota between different weight reduction programs. *Surg. Obes. Relat. Dis.* 2019, 15, 749–758. [CrossRef]

75. Spaeth, K.R.; et al. Changes in the gut microbiome of post-menopausal women 2 weeks after initiating a structured weight loss intervention. *Cancer Res.* 2017, 77, P4-13-03. [CrossRef]

76. Spaeth, K.R.; et al. Changes in the gut microbiome of post-menopausal women 2 weeks after initiating a structured weight loss intervention. *Cancer Res.* 2017, 77, P4-13-03. [CrossRef]

77. Spaeth, K.R.; et al. Changes in the gut microbiome of post-menopausal women 2 weeks after initiating a structured weight loss intervention. *Cancer Res.* 2017, 77, P4-13-03. [CrossRef]
96. Zhou, T.; Heianza, Y.; Chen, Y.; Li, X.; Sun, D.; DiDonato, J.A.; Pei, X.; LeBoff, M.S.; Bray, G.A.; Sacks, F.M.; et al. Circulating Gut Microbiota Metabolite Trimethylamine N-Oxide (TMAO) and Changes in Bone Density in Response to Weight Loss Diets: The POUNDS Lost Trial. *Diabetes Care* 2019, 42, 1365–1371. [CrossRef]

97. Zolotarevsky, M.V.; Zolotarevsky, E.; DeBenedet, A.; Duda, J.; Velarde, M.; Lyons, D.; Montagano, J.; Gunaratnam, N.T. A multifaceted approach to weight loss is effective in obese NASH and GERD patients in a community GI practice: An interim analysis. *Gastroenterology* 2018, 154, S-431. [CrossRef]

98. Zou, H.; Wang, D.; Ren, H.; Cai, K.; Chen, P.; Fang, C.; Shi, Z.; Zhang, P.; Wang, J.; Yang, H.; et al. Effect of Caloric Restriction on BMI, Gut Microbiota, and Blood Amino Acid Levels in Non-Obese Adults. *Nutrients* 2020, 12, 631. [CrossRef]