



# Could Dietary Goals and Climate Change Mitigation Be Achieved Through Optimized Diet? The Experience of Modeling the National Food Consumption Data in Italy

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**Objective:** The aim of this study is to define a healthy and sustainable diet model with low GHGE, fulfilling dietary requirements, and considering current Italian food consumption patterns.

**Design:** A duly designed database was developed, linking food nutritional composition and GHGE based on 921 food items consumed in Italy according to the last national food consumption survey (INRAN-SCAI 2005–2006). Linear programming was used to develop new diet plans separately for males and females, aged 18–60 years ( $n = 2,098$  subjects), in order to minimize GHGE. The program is based on dietary goals and acceptability constraints as well as on 13 nutrient requirement constraints aiming to reach a healthy and acceptable diet for the Italian population.

**Results:** Diet optimization resulted in a nutritionally adequate pattern minimizing GHGE values (4.0 vs. 1.9 kg CO<sub>2</sub>e/day for males and 3.2 vs. 1.6 kg CO<sub>2</sub>e/day for females). In both sexes, the nutrient intake of the optimized diet was at the established lower bound for cholesterol and calcium and at the established upper bound for free sugar and fiber. In males, intake of zinc was at the established lower bound whereas iron was at the established upper bound. Consumption of red meat and fruit and vegetables was at the established lower and upper bound, respectively, in both males and females. Despite the decrease in meat consumption, especially red meat, in the optimized diet with respect to the observed diet, levels of iron intake in females increased by 10% (10.3 vs. 11.3 mg/day) but remained below the adequate intake established in Italian national DRIs.

**Conclusions:** An attainable healthy dietary pattern was developed that would lead to the reduction of GHGE by 48% for males and by 50% for females with respect to current food consumption in the Italian adult population. Health-promoting dietary patterns can substantially contribute to achieve related Sustainable Development Goals.

**Keywords:** dietary intakes, linear programming, greenhouse gas emissions, food consumption, diet optimization, healthy and sustainable diet, nutritional recommendations, sustainable development goals

## INTRODUCTION

An adequate and balanced diet contributes to achieve a good state of health and to prevent chronic diseases (1, 2). Most high-income countries, Italy among them, develop their country-specific nutrient-based recommendations, referred to as Dietary Reference Intake (DRIs), for assessment and planning of adequate dietary intake (3–5). Healthy food consumption patterns meeting these requirements can be promoted through the development of Food-based Dietary Guidelines, which help to maintain high consumption of local and culture-specific foods (6, 7).

Industrialized countries are facing a wide range of diet-related non-communicable diseases, obesity among population, and micronutrient deficiency. Moreover, due to unbalanced dietary profiles, the DRIs are far from being met for some key nutrients (8). The observation of current food consumption patterns shows that a healthier diet could be obtained in the Italian population through an increase in consumption of vegetable source foods such pulses, fruits, and vegetables and a decrease of consumption of red and processed meat (9, 10).

In addition to nutrition and health considerations, there is an increasing concern regarding the environmental impact of food production as *diets are inextricably link human health and environmental sustainability* (11). Therefore, the achievement of the 12th Sustainable Development Goal (SDG), i.e., “responsible consumption and production” necessarily implies changes in the food consumption pattern. Moreover, the diet is referred to, directly or indirectly, in many “Sustainable Development Goals” (6), including Defeating hunger (2nd), Health and well-being (3rd), Quality education (4th), Consumption and responsible production (12th), and Fight against climate change (13th) (12). Notwithstanding complexity of sustainable diets (13), more and more countries are developing Food-Based Dietary Guidelines that allow promoting diets that are both healthy and sustainable (14, 15) and recently, a conceptual framework to evaluate sustainability in dietary guidelines has been published (16). It is indeed estimated that, globally, food system accounts for 19 to 29% of all greenhouse gas emissions (GHGE), considered to be the principal driver of climate change (17). In Italy, emissions from the agricultural sector (with the exclusion of energy used for agricultural purpose) account for 6.9% of total national GHGE, which is the second source of emissions after the energy sector (81.8%) (18).

The goal set by the European Commission is to reduce domestic emissions by 40% to 2030, compared to baseline data of 1990, in order to mitigate climate change (19). The reduction of GHGE could be achieved through changes in food consumption habits, since production of the same

quantities of different foods is responsible for different levels of greenhouse gas, with livestock having the highest emission level (20). Dietary recommendations dealing with environmental sustainability typically focus on limiting consumption of animal-based products (21–23). Alongside, public health authorities recommend plant-based diets for health benefits, such as a lower risk of non-communicable diseases (24), and a limited amount of animal products, especially red and processed meat, in order to decrease health risk, such as colon cancer (25). A review of epidemiological studies on the environmental impact of diets suggested that dietary changes aimed to reduce diet-related GHGE may also promote health (14, 26). A research project on food and nutrition systems has evidenced that consuming a healthy and balanced diet increases nutrition-related parameters, allows for stabilizing climate, increases biodiversity conservation, reduces a little bit of productivity, but increases value added (27).

A possible approach to avail of commonalities between healthy diets and diets with low environmental impact is to design optimized diets in the context of multiple constraints through linear programming. Diet optimization by linear programming is a mathematical approach that optimizes (minimizes or maximizes) a linear function of decision variables while complying with multiple constraints. Use of linear programming to solve the so-called “diet problem” in order to find a solution joining a healthy diet and a low-cost diet started in 1945 when Jerry Cornfield started to study this topic for the Army in the Second World War (28). Linear programming has been used for decades for informing nutrition; in fact, diet was one of the first problems on which optimization method was tested by Dantzig (29). Recently several food-based dietary guidelines have been developed based on optimized healthy diets (30).

Previous studies have also suggested that diet optimization methods can be useful to develop a nutritionally adequate diet with low GHGE, while maintaining the social and cultural preferences of the population, by taking the mean population dietary intake as the baseline (31, 32). The research focuses on estimating a dietary pattern with low environmental impact while maintaining the social and cultural preferences of the population (33). Macdiarmid et al. (34) published a diet that meets dietary requirements with low GHGE without ruling out meat or dairy products from the diet. An interesting study (35) showed that a theoretical vegetarian diet does not reduce GHGE more than an optimized omnivore diet.

Another issue of diet optimization considering low GHGE regards the need for standardized environmental data for linear programming. In most high-income countries, including Italy, country-specific food composition databases are available to determine the nutrient composition of food consumption patterns. No similar country-specific standardized environmental food databases of GHGE are available. Studies providing GHGE data for some foods (36, 37) do exist, but these data are not comparable with one another, since the methodologies are not standardized. Hence, there is a need to integrate and to standardize an environmental food database (38) also in Italy.

In addition, only a few studies on optimized diet minimizing GHGE are available for Italy, since they resulted from a European

**Abbreviations:** AR, Average requirement; CH<sub>4</sub>, Methane; CO<sub>2</sub>, Carbon dioxide; CO<sub>2</sub>e, Carbon dioxide equivalent; DRIs, Dietary Reference Intake values; GHGE, Greenhouse gas emissions; GWP, Global warming potential; IARC, International Agency for Research on Cancer; INRAN, National Research Institute for Food and Nutrition; SCAI, Food Consumption Study in Italy; LCA, Life cycle assessment; N<sub>2</sub>O, Nitrous oxide; PRI, Population reference intake; PUFA, Polyunsaturated fatty acids; SDGs, Sustainable Development Goals; SFA, Saturated fatty acids; WHO, World Health Organization.

perspective (37) or they concern some specific target groups of a small and no representative sample (39).

The principal aim of this study was to develop an optimized diet for the adult Italian population, thus defining a nutritionally optimal food consumption pattern able to meet the national DRIs and with the minimum GHGE. Then, a linear programming approach based on the last dietary data from INRAN-SCAI 2005–2006 food consumption database has been applied. To this purpose, a GHGE database for a wide range of foods items was created from literature considering Italian specific data. The secondary aim of the present study is to investigate the impact of an optimized diet, likely to be low in meat and dairy products, in terms of the coverage of requirements for selected nutrients for which these products are important contributors in the current Italian diet.

## MATERIALS AND METHODS

### Dietary Data

The survey methodology to collect the most recently published nationwide food consumption data has been described by Leclercq et al. (9). The national cross-sectional survey (INRAN-SCAI 2005–2006) had been carried out by the National Research Institute for Food and Nutrition (INRAN) on a random sample of the Italian population. The studied sample consisted of 3,323 individuals belonging to 1,329 households (1,501 males and 1,822 females, aged 0.1–97.7 years). The adult subsample analyzed in the present study was composed of 18–60-year-old individuals ( $n = 2,098$  subjects), a homogeneous group of adults for the nutritional recommended range values (4).

A 3-day semi-structured diary was used for participants to record all their food and drink consumption in addition to their intake of nutritional supplements and of medicines containing nutrients.

Individual intakes of foods were calculated with the use of the software INRAN-DIARIO version 3.1 (9). The INRAN-SCAI 2005–2006 food database included 1,119 food items and 123 dietary supplement foods. The food composition database in terms of nutrients has been described by Sette et al. (40) and used for the present study. The selected subset of foods for the present analysis amounts to 921 food items, with the exclusion of infant formula (198 food items) and dietary supplement foods because infant population was not considered and GHGE values for supplements are currently inconsistent.

The classification of food items was performed at the ingredient level as reported by Leclercq et al. (9) and was aggregated into 15 food categories and 55 subcategories. **Appendix 1** provides a description of the consumed food items.

Weighted mean nutrient content (energy, protein, total fat, SFA, PUFA, carbohydrates, cholesterol, free and intrinsic sugars, fiber, calcium, iron, zinc, and vitamin B<sub>12</sub>) have been calculated by each food category and subcategory for males and females separately. These values were standardized to 100 g in order to be used in the linear model.

### GHGE Data

GHGE values, expressed as kilograms CO<sub>2</sub> equivalents (kg CO<sub>2</sub>e), were identified from national and international published Life Cycle Assessment (LCA) studies or green literature (conference papers, project report, technical sheet) with similar system boundaries that included food processing, distribution, and retailing. More than 50 scientific articles were considered to extract values of GHGE for individual foods. A summary of GHGE literature references on food items used in the present study is reported in **Appendix 2**. More than 50% of these articles refer to studies developed in Italy. Eighteen Italian technical sheets of environmental product declaration were used in the calculation of GHGE of some food products (**Appendix 2**). The assessment of combined impact of different greenhouse gases, such as methane (CH<sub>4</sub>) or nitrous oxide (N<sub>2</sub>O), was achieved using Global Warming Potential (GWP) assuming a 100-year perspective, where the emission expressed as CO<sub>2</sub>e (Carbon dioxide equivalent) allows one to describe different greenhouse gases in a common unit; e.g., 1 kg of CH<sub>4</sub> is equal to 25 kg of CO<sub>2</sub>e and 1 kg of N<sub>2</sub>O is equal to 298 kg of CO<sub>2</sub>e (41).

A total number of 102 GHGE values of food products named as “indicator products” was identified from the literature (**Appendix 2**). **Appendix 1** specifically shows the indicator products considered for each category and subcategory. Each indicator product for which data points identified were matched to similar food items in the subcategory is indicated in the footnotes. In some cases, it was considered enough that one indicator product represented several items consumed in the same food subcategory. For instance, orange juice GHGE value was applied for all types of fruit and vegetable juices (e.g., nectar, carrot juice, orange juice), or cola GHGE value from a specific brand was applied for all types of carbonate beverages (e.g., cola, soda, ginger ale, orange, tonic water).

### Mean Values and Uncertainty Ranges of GHGE Data

For each indicator product, the GHGE value was obtained as the mean of the data points; then, the GHGE value for each subcategory was calculated by averaging the GHGE values of the component indicator products.

In addition to calculating mean values of GHGE, uncertainty ranges were produced for this study but not used for the optimization to address their great variability both within and between similar food items. For example, the GHGE variation per kilogram of food item was 0.6–2.4 kgCO<sub>2</sub>e for milk and yogurt, 1.4–12.3 kgCO<sub>2</sub>e for meat (12.3–18.6 kgCO<sub>2</sub>e for beef), and 0.8–18.9 for cheese (2.6–9.1 kgCO<sub>2</sub>e for hard cheese). The same principles proposed by Hartikainen and Pulkkinen (42) were used and adapted for this study in order to develop a database:

- *Quartiles*: whenever four or more data sources from literature were available, we used the lower quartile as the minimum value of uncertainty range and the upper quartile as the maximum value.
- *minimum–maximum*: whenever only 2–3 data sources were available, we used minimum and maximum values.

- **unique value 50-50:** if there was only one GHGE estimate, we used  $-50\%$ – $+50\%$  uncertainty range, unless the estimate was a national evaluation, but it was considered reasonably reliable according to international estimates of similar products; in this case, the range was  $-25\%$ – $+25\%$ .

## Linear Programming Model

A linear programming model has been developed to minimize GHGE while satisfying a set of nutritional, acceptability, and healthy constraints. GHGE is a linear function of the 55 food subcategory amounts ( $x_1, x_2, \dots, x_{55}$ ), i.e.,

$$GHGE = \sum_{k=1}^{55} c_k x_k$$

where  $c_k$  is the GHGE per  $g$  of food category  $k$ . Diets are constructed to minimize the objective  $GHGE$ , while satisfying the following constraints.

## Nutritional Constraints

Nutrient and energy constraints were derived from national dietary reference values (4) in terms of established lower and upper bound values for total energy, proteins, total fat, saturated fatty acids (SFA), polyunsaturated fatty acids (PUFA), carbohydrates, free and intrinsic sugar, cholesterol, fiber, vitamin B<sub>12</sub>, iron, calcium, and zinc. The choice of iron, calcium, zinc, and vitamin B<sub>12</sub> as micronutrients was related to the fact that their coverage in Italian diet is critical in some classes of ages and physiological conditions, such as iron in women in childbearing age. In addition to that, processed meat and milk products are key sources of these micronutrients. It is therefore expected that a lower content of these animal foods in an optimized low carbon footprint diet might jeopardize the coverage of nutrient requirements for these micronutrients.

Free and intrinsic sugar recommendation was defined according to WHO (43) that considers free sugar as all sugars added to foods or drinks by the manufacturer, cook, or consumer, as well as sugars naturally present in honey, syrups, fruit juices, and fruit juice concentrates. Free sugars have different physiological significance from the so-called intrinsic sugars, which are those incorporated within the structure of intact fruit and vegetables, and sugars from milk (lactose and galactose). We therefore calculated free sugar from foods such as biscuits, cakes, snacks, milk-based desserts, yogurt with sugars, candies, chocolates, alcoholic and soft drinks, and fruit juices and preserved fruits with sugar excluding fresh fruits and vegetable and milk and natural yogurts.

Different values were considered for males and females, respectively, as shown in **Tables 1, 2**.

## Acceptability Constraints

The mean total amount of food and beverage intake was constrained to range between 80 and 140% of the observed mean intake (2,281 g/day for men and 2,088 g/day for female) in order to comply with acceptability of the diet. The upper limit was increased with respect to the value of 120% used by Perignon et al. (26) to compensate for total removal of some food categories such

**TABLE 1 |** Nutritional constraints for daily intake compared with the mean observed diet (INRAN-SCAI 2005–2006) and the optimized diet from linear programming model for the adult male population, 18–60 years<sup>a</sup>.

	Established lower and upper bound	Observed diet	Optimized diet
<b>Nutritional</b>			
GHGE <sup>b</sup> (kgCO <sub>2</sub> e)		4.0	1.9
Energy (kcal/day)	2,400–2,460	2,406	2,400
Protein (g/day)	60–92	93.2	77.9
Total fat (% Energy)	24.5–30.8	36.0	30.5
SFA <sup>c</sup> (% Energy)	7.0–10.1	11.2	8.8
PUFA <sup>d</sup> (% Energy)	4.8–10.1	4.6	5.5
Cholesterol (mg/day)	250–300	334.0	250.0
Carbohydrates (% Energy)	46.8–65.7	47.5	60.2
Free + intrinsic sugar (% Energy)	10.4–16.3	13.2	14.0
Free sugar (% Energy)	4.2–5.5	7.9	5.5
Fiber (g/day)	24–26	19.5	26.0
Calcium (mg/day)	900–1,100	801.0	900.0
Iron (mg/day)	9–11	12.6	11.0
Zinc (mg/day)	11–13	12.7	11.0
Vitamin B <sub>12</sub> (μg/day)	2–3	6.7	2.6
Alcohol (g/day)	0	13.4	0.0
Fruit and vegetables (g/day)	400–500	423.0	500.0
Red meat (g/day)	10–30	73.0	10.0
Processed meat <sup>e</sup> (g/day)	0	36.0	0.0
<b>Cultural acceptability</b>			
Total weight of food (g/day)	1,825–3,193 (80–140) % of the total weight of the mean observed diet	2,281	2,941
<sup>f</sup> Food categories and subcategories	5th <sub>≤</sub> and ≤90th percentile calculated on the mean observed diet <sup>a,c</sup>	(see <b>Table 3</b> )	

<sup>a</sup>Non-consumers included; <sup>b</sup>Greenhouse Gas Emission; <sup>c</sup>Saturated Fatty Acids; <sup>d</sup>polyunsaturated Fatty Acids; <sup>e</sup>The term "processed meat" refers to meat (usually red meat) preserved by smoking, curing, or salting, or by addition of preservatives. Meat preserved only by refrigeration, however they are cooked, are usually not classified as "processed meat." <sup>f</sup>Except for pulses and fish where the quantities were established as  $\geq 20$  g/day.

as processed meat and alcoholic beverages in the diet. Moreover, food category and subcategory quantities were constrained to be within the 5th and the 90th percentile of the observed food consumption. Percentiles were calculated by gender.

## Healthy Constraints

In order to ensure that optimized quantities of some food groups that are usually either promoted or restricted for a sustainable diet are in accordance with international recommendation for healthy diet, established lower and upper bounds were set as constraints for fruits and vegetable and alcohol beverages categories and for red meat and processed meat subcategories.

**TABLE 2 |** Nutritional constraints for daily intake requirements compared with the mean observed diet (INRAN-SCAI 2005–2006) and the optimized diet from linear programming model for the adult female population, 18–60 years<sup>a</sup>.

	Established lower and upper bound	Observed diet	Optimized diet
<b>Nutritional</b>			
GHGE <sup>b</sup> (kgCO <sub>2</sub> e)		3.2	1.6
Energy (kcal/day)	1,900–1,982	1,947	1,900
Protein (g/day)	52–73	76.3	67.3
Total fat (% Energy)	24.1–31.3	36.8	28.8
SFA <sup>c</sup> (% Energy)	6.4–10.4	11.4	9.2
PUFA <sup>d</sup> (% Energy)	4.5–10.4	4.7	4.7
Cholesterol (mg/day)	250–300	266.0	250.0
Carbohydrates (% Energy)	46.0–66.7	48.7	60.7
Free + intrinsic sugar (% Energy)	10.3–16.6	17.8	15.4
Free sugar (% Energy)	4.0–5.5	8.3	5.5
Fiber (g/day)	24–26	17.5	26.0
Calcium (mg/day)	900–1,100	729.0	900.0
Iron (mg/day)	17–19 <sup>e</sup>	10.3	11.3
Zinc (mg/day)	8–10	10.6	10.0
Vitamin B <sub>12</sub> (μg/day)	2–3	5.6	2.6
Alcohol (g/day)		4.8	
Fruit and vegetables (g/day)	400–500	420.0	500.0
Red meat (g/day)	10–30	54.0	10.0
Processed meat <sup>f</sup> (g/day)		24.0	
<b>Culturally acceptability</b>			
Total weight of food (g/day)	1,670–2,923 (80–140)% of the total weight of the mean observed diet	2,088	2,900
<sup>g</sup> Food categories and subcategories	5th ≤ and ≤ 90th percentile calculated on the mean observed diet <sup>a,c</sup>	(see <b>Table 3</b> )	

<sup>a</sup>Non-consumers included; <sup>b</sup>Greenhouse Gas Emission; <sup>c</sup>Saturated Fatty Acids; <sup>d</sup>Polysaturated Fatty Acids; <sup>e</sup>This range was not used as explained in the Results section. After the first running of the model, it was observed that the maximum value of iron compatible with all other constraints is 11.8 g/day; <sup>f</sup>The term “processed meat” refers to meat (usually red meat) preserved by smoking, curing, or salting, or by addition of preservatives. Meat preserved only by refrigeration, however they are cooked, are usually not classified as “processed meat.” <sup>g</sup>Except for pulses and fish for which quantities were fixed as ≥20 g/day.

The term “red meat” refers to beef, pork, horse, lamb, and goat from domesticated animals. The amount was calculated based on the International Agency for Research on Cancer (IARC) (24) recommendation for cancer prevention corresponding to <400 g per week of raw weight of red meat. For these reasons, the constraint used in this paper was restrictive (<30 g/day) in consideration of the benefits for general public health prevention in relation to other non-communicable diseases. Fruit and vegetables do not include pulses and fruit juices. The recommended amount for fruit and vegetable (at least 400 g/day)

is derived from WHO/FAO (44). A zero upper limit was imposed to the model for alcoholic beverages (45) and processed meat according to international recommendations (24).

Moreover, a minimum intake of pulses and fish at least of 20 g/day was added in consideration of the high importance of consumption of these food groups in the context of a balanced diet (4, 6).

All the considered constraints were expressed as linear functions of food subcategory amounts as follows:

$$lb_j \leq \sum_{k=1}^{55} a_{jk} x_k \leq ub_j$$

The values  $lb_j$  and  $ub_j$  define the established lower and upper bounds for the  $j$ th constraint and  $a_{jk}$  are either the contribution of the food subcategories per unit weight (DRIs) or are all equal to 1 (acceptability of total weight) or assume value 1 or 0 when referring to constraints on single categories or subcategories (5th and 90th percentiles or recommended values).

For the subcategory “processed meat” and the category “alcoholic beverages,” the recommendation present in the Italian national dietary guidelines (6) is to avoid consumption. Therefore, the corresponding subcategories were constrained to have a zero consumption. Despite these values being very far from the mean, they are still realistic since the 5th percentile of the observed consumption is equal to zero.

## Statistical Analysis

Descriptive statistics (mean, 5th and 90th percentile) were calculated for male and female separately using the Statistical Analysis System computer software package (SAS package version 9.01; SAS Institute Inc., Cary, NC).

Optimization was performed using the solver for linear programming of the Optimization Toolbox<sup>TM</sup> of Matlab<sup>®</sup> (<https://www.mathworks.com/products/optimization.html>).

## RESULTS

At the first stage of application, linear programming provided a solution for male but could not provide a solution for female population data. This means that there exists no diet satisfying all the constraints no matter the GHGE level. The comparison of the sets of constraints for male and female population suggests that infeasibility may depend on the much higher level of iron requested for females. Removing the iron constraint makes the model feasible. Consequently, in order to identify the highest possible iron intake compatible with all other constraints, iron intake was maximized while satisfying the remaining set of nutritional, acceptability, and healthy constraints. A maximum values of mean iron intake of 11.8 mg/day was obtained in females. This means that a diet satisfying all the constraints (apart that for iron) cannot have a mean intake of iron >11.8 mg/day. Hence, the constraint on iron intake related to 17–19 mg/day (4) was not considered (**Table 2**).

The model resulted into an optimized diet based on 13 nutrient constraints and well-defined acceptability constraints.

The mean reduction of GHGE was 4.0 vs. 1.9 kg CO<sub>2</sub>e/day for male and 3.2 vs. 1.6 kg CO<sub>2</sub>e/day for female. **Tables 1, 2** show results by males and females comparing the observed diet with the optimized diet.

In terms of nutrients, the observed diet showed that fiber intake for male and female resulted in covering <80% of the recommendation in the observed diet; SFA and vitamin B<sub>12</sub> in both males and females and cholesterol intakes only in male exceeded the recommended upper limits. Protein requirement (PRI value) referred to the Italian national DRI<sup>4</sup> and was covered by 83% of the total sample of adults (data not shown in the table).

The optimized diets are slightly different for males and females. In both sexes, the daily intake of the optimized diet was at the established lower bound for cholesterol and calcium, and at the established higher bound for free sugar and fiber. In males, the optimized diet was also at the established lower bound for zinc intake and at the established higher bound for iron intake. In addition to that, the optimized diet was at the established higher bound for fruit and vegetable consumption (500 g/day) (**Tables 1, 2**) whereas red meat was at the established lower bound (10 g/day) in both males and females.

The daily intake for food categories and subcategories of the optimized diet is reported in **Table 3** for males and females. Nine subcategories for males and females belonging to the “potatoes and crisps,” “canned fruit,” “meat substitute,” “offal, blood and their product,” “milk-based dessert and substitute,” “cacao and cacao-based powder,” “artificial sweeteners,” “meal substitute,” and “other fats” groups have not reached admissible solutions because of the low consumption level by the adult sample. The optimized diet is rich in carbohydrates, fiber, and total fat since the intake of pasta and butter for males and potatoes, nuts, milk, and yogurt for both males and females is very similar or equal to the 90th percentile of observed current consumption.

The model resulted in consumption of “spices and herbs” subcategory and “tap water” at the 90th percentile and reduced portion of meat was established according to the healthy constraints in the optimized diet.

Some food categories were not considered to assess the acceptability of the optimized diet because their 90th percentile in the observed diet was zero. This is the case for “breakfast cereals” in males and for “potatoes crisp,” “canned fruit,” “meat substitute and offal, blood and their products,” “milk-based dessert,” “cacao and cacao-based powder,” “artificial sweeteners” and “meal substitute” for both males and females.

The optimized and observed consumption of total fruit were similar in males’ diet, with a higher proportion of “citrus fruit and other fruits” but neither “exotic fruit” nor “fruit, canned” in the optimized diet. The total consumption of vegetables was higher in optimized diet vs. the observed diet, particularly due to a higher consumption of leafy and fruiting vegetables and of roots and onion. Consumption of processed vegetables was zero (for both males and females) in the optimized diet.

The optimized consumption for some food subcategories showed minor changes from the observed consumption (within plus or minus 20% of the observed diet). It is the case, for example, in both males and females for “fresh fish.” Conversely, “herbal tea, tea, coffee and substitute (decaffeinate),” volumes

decrease to the lower level at the 5th percentile. The level of meat consumption fits the lower allowable level (5th percentile of the population eats 40.8 g/day or more for males and 24.4 g/day or more for females) with an increase of the quantity of poultry for males (22.5 g/day for observed diet vs. 30.8 g/day for optimized diet). The optimized diet includes 10.0 g/day of pork meat in both males and females, corresponding to the established lower bound of the healthy constraint set for red meat.

The optimized diet resulted in the minimum recommended intake for animal food products as fish and meat, for both males and females. This results in trade-offs to comply with nutrient constraints on quantities of specific nutrients. In particular, the optimized diet limiting meat category emphasizes the importance of other food categories. In both males (**Figure 1**) and females (**Figure 2**), this concerns (i) “cereals” as sources of proteins, (ii) “beverages” as sources of calcium, and (iii) “eggs” and “milk and yogurt” categories as sources of vitamin B<sub>12</sub>.

## DISCUSSION

The present study shows how nutrient-based recommendations proposed by national DRI (4) can be transformed into a practical dietary advice among the Italian adult population, using a linear programming optimization model and the national dietary intake data. To our knowledge, this is the first exercise of applying a mathematical model for diet optimization, using national food consumption data linked to a country-specific GHGE database. In order to provide a healthy and acceptable diet, the optimization, besides minimizing the GHGEs, considers various kinds of constraints: nutrient coverage, acceptability, and health promotion. Nutritional requirements are based on country-specific recommendations (4) from which were derived adequate range values for energy and nutrients intake. Acceptability constraints on food quantities were established to ensure that the optimized diet remained within the range of diet consumed by the Italian population, and were introduced by limiting the food subcategories consumption within the 5th and 90th percentiles of the observed population data. Health constraints led to a complete removal processed meat and alcohol from the diet since they are classified as carcinogen in humans according to IARC (24, 46). The issue of iron intake in optimized diet for females requires a specific consideration. At the first stage of application of linear programming optimization to female population data, no solution was found. This means that there exists no diet satisfying all the constraints no matter the GHGE level. Iron requirement in female compared with usual intake is a critical issue. Italian female diet is low in terms of iron intake (9), and in some groups of population, there is evidence of moderate clinical deficiencies (47). The reason for not obtaining a diet model compatible with iron recommendation in females is related to the partial incompatibility between this specific nutritional constraint and the more general health constraint. If the red meat constraint had been removed, a higher iron intake would have been reached in females. The present study shows that an acceptable diet, nutritionally adequate, and health promoting, is also compatible with a positive mitigation of climate impact. The

**TABLE 3 |** Food categories and subcategories of daily portion of the observed and optimized diets by the adult 18–60-year-old male and female population<sup>a</sup>.

Categories	Subcategories	Observed diet (g/day)						Optimized diet (g/day)	
		Males			Females			Males	Females
		5th	90th	Mean	5th	90th	Mean		
1	Cereals, cereal products, and substitutes	130.1	438.7	298.8	98.9	345.5	233.2	388.1	298.3
	1 Bread and flour	29.6	262.8	150.2	11.9	188.0	103.9	186.7	174.9
	2 Pizza	0.0	33.3	9.1	0.0	33.3	7.8	0.0 <sup>c</sup>	0.0 <sup>c</sup>
	3 Breakfast cereals	0.0	0.0	1.0	0.0	7.0	1.9	0.0 <sup>d</sup>	0.0 <sup>c</sup>
	4 Pasta with eggs, filled, etc.	0.0	13.5	4.5	0.0	10.8	3.3	13.5 <sup>b</sup>	10.8 <sup>b</sup>
	5 Pasta, pasta substitute and flour	16.7	124.7	78.4	12.4	106.1	63.5	124.7 <sup>b</sup>	49.9
	6 Rice	0.0	43.5	16.5	0.0	39.5	15.2	21.0	0.0 <sup>c</sup>
	7 Biscuits	0.0	42.2	13.8	0.0	35.3	12.6	42.2 <sup>b</sup>	35.3 <sup>b</sup>
	8 Cakes and sweet snacks	0.0	54.9	19.7	0.0	50.0	16.2	0.0 <sup>c</sup>	0.0 <sup>c</sup>
	9 Savory fine bakery products	0.0	20.0	5.7	0.0	27.4	9.0	0.0 <sup>c</sup>	27.4 <sup>b</sup>
2	Pulses	0.0	38.6	11.3	0.0	36.9	11.2	20.0	36.9 <sup>b</sup>
	10 Pulses, fresh or processed	0.0	38.6	11.3	0.0	36.9	11.2	20.0	36.9 <sup>b</sup>
3	Vegetables	75.0	384.2	231.5	71.8	339.3	211.3	306.8	329.3
	11 Leafy, fruiting and other vegetables, fresh	35.6	301.1	167.9	37.0	271.9	157.6	248.0	271.9 <sup>b</sup>
	12 Roots and onions, fresh	1.1	53.6	19.7	0.3	52.8	19.1	53.6 <sup>b</sup>	52.8 <sup>b</sup>
	13 Vegetables, processed	0.0	91.1	41.8	0.0	73.8	32.6	0.0 <sup>c</sup>	0.0 <sup>c</sup>
	14 Spices and herbs	0.0	5.2	2.1	0.0	4.7	1.9	5.2 <sup>b</sup>	4.7 <sup>b</sup>
4	Potatoes and tapioca	0.0	135.9	55.0	0.0	119.3	46.6	133.0	116.8
	15 Potatoes and potato-based dishes and tapioca, excl. crisps	0.0	133.0	54.2	0.0	117.3	46.1	133.0 <sup>b</sup>	116.8
	16 Potatoes crisps	0.0	0.0	0.8	0.0	0.0	0.5	0.0 <sup>d</sup>	0.0 <sup>d</sup>
5	Fruit	0.0	390.4	194.6	0.0	399.7	211.6	193.2	170.7
	17 Citrus and stone fruits, fresh	0.0	368.3	174.0	0.0	380.0	191.5	183.9	162.3
	18 Exotic fruits	0.0	66.7	17.4	0.0	58.3	17.2	0.0 <sup>c</sup>	0.0 <sup>c</sup>
	19 Nuts, seeds, dried fruit, olives and their products	0.0	9.3	3.1	0.0	8.4	2.6	9.3 <sup>b</sup>	8.3
	20 Fruit canned	0.0	0.0	0.1	0.0	0.0	0.2	0.0 <sup>d</sup>	0.0 <sup>d</sup>
6	Meat, meat products, and substitutes	40.8	220.7	132.6	24.4	166.7	97.9	40.8 <sup>c</sup>	24.4 <sup>c</sup>
	21 Beef and veal, not preserved, excl. offal	0.0	102.3	49.5	0.0	85.5	38.0	0.0 <sup>c</sup>	0.0 <sup>c</sup>
	22 Pork, not preserved, excl. offal	0.0	57.6	16.4	0.0	46.7	11.5	10.0	10.0
	23 Poultry and game, not preserved, excl. offal	0.0	65.5	22.5	0.0	51.8	18.8	30.8	14.4
	24 Processed meat	0.0	80.0	36.1	0.0	54.0	23.7	0.0 <sup>e</sup>	0.0 <sup>e</sup>
	25 Other meats, not preserved, excl. offal	0.0	33.3	6.8	0.0	0.0	4.9	0.0 <sup>c</sup>	0.0 <sup>d</sup>
	26 Meat substitute	0.0	0.0	0.0	0.0	0.0	0.1	0.0 <sup>d</sup>	0.0 <sup>d</sup>
	27 Offals, blood, and their product	0.0	0.0	1.2	0.0	0.0	0.8	0.0 <sup>d</sup>	0.0 <sup>d</sup>
7	Fish and seafood	0.0	122.8	48.8	0.0	113.5	45.0	20.0	20.0
	28 Crustaceans, shellfish, mussels	0.0	69.0	16.6	0.0	55.2	13.4	0.0 <sup>c</sup>	0.0 <sup>c</sup>
	29 Fish, fresh	0.0	68.2	25.0	0.0	67.9	25.5	20.0	20.0
	30 Fish, preserved	0.0	23.5	7.3	0.0	22.5	6.2	0.0 <sup>c</sup>	0.0 <sup>c</sup>
8	Milk, milk products, and their substitutes	21.7	345.8	177.9	24.3	345.6	194.3	311.9	345.6 <sup>b</sup>

(Continued)

TABLE 3 | Continued

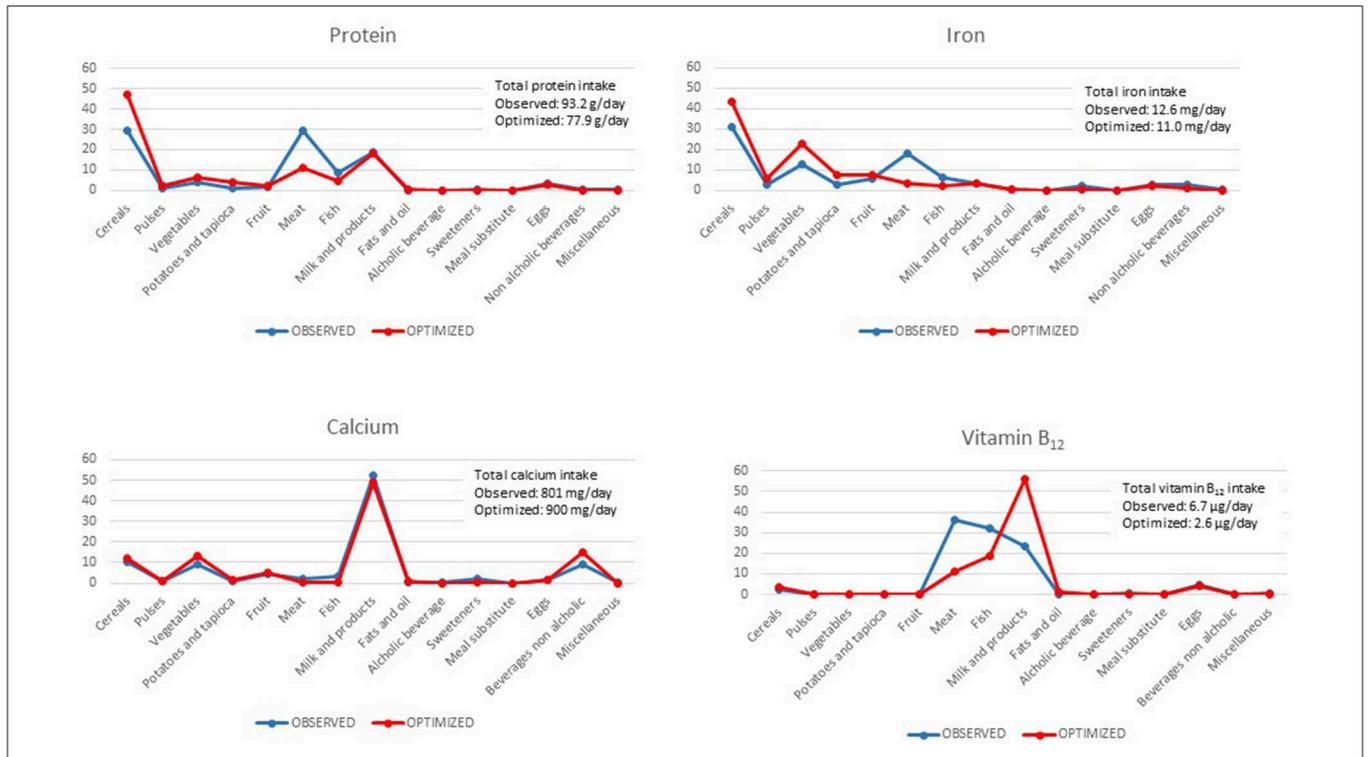
Categories	Subcategories	Observed diet (g/day)						Optimized diet (g/day)			
		Males			Females			Males	Females		
		5th	90th	Mean	5th	90th	Mean				
9	Oils and fats	31	Milk, milk-based beverages	0.0	240.8	93.8	0.0	250.0	111.3	240.8 <sup>b</sup>	250.0 <sup>b</sup>
	32	Yogurt and fermented milk	0.0	50.0	16.1	0.0	93.7	27.0	50.0 <sup>b</sup>	92.2	
	33	Milk based dessert and substitute	0.0	0.0	1.3	0.0	0.0	1.1	0.0 <sup>d</sup>	0.0 <sup>d</sup>	
	34	Cheese and substitutes	3.8	125.8	66.7	3.1	102.6	54.9	21.0	3.4	
	21.5		68.1	46.0	18.2	56.9	39.0	52.1	30.4		
	35	Olive oil	15.3	55.1	36.6	12.6	47.3	31.3	24.0	12.6 <sup>c</sup>	
	36	Other vegetable oil	0.0	8.8	3.2	0.0	6.7	2.7	8.8 <sup>b</sup>	5.3	
	37	Butter, creams	0.0	14.7	4.9	0.0	12.5	4.0	14.7 <sup>b</sup>	12.5 <sup>b</sup>	
10	Sweet products and substitutes	38	Other fats	0.0	4.7	1.3	0.0	3.3	0.9	4.7 <sup>b</sup>	0.0 <sup>c</sup>
	2.7		79.2	36.9	0.0	67.7	31.3	19.6	19.5		
	39	Ice cream, popsicle and substitutes	0.0	33.3	11.1	0.0	33.3	8.9	2.2	8.6	
	40	Chocolate and substitutes	0.0	7.5	2.4	0.0	6.7	2.1	0.0 <sup>c</sup>	6.7 <sup>b</sup>	
	41	Sugar, fructose, honey, and other nutritious sweeteners	0.0	38.3	19.6	0.0	33.8	16.2	17.3	0.0 <sup>c</sup>	
	42	Candies, jam, and other sweet products	0.0	10.0	3.3	0.0	13.3	3.6	0.0 <sup>3</sup>	4.2	
	43	Cacao and cacao-based powder	0.0	0.0	0.5	0.0	0.0	0.5	0.0 <sup>d</sup>	0.0 <sup>d</sup>	
	44	Artificial sweeteners	0.0	0.0	0.0	0.0	0.0	0.1	0.0 <sup>d</sup>	0.0 <sup>d</sup>	
11	Meal substitute	0.0	0.0	0.1	0.0	0.0	0.0	0.0 <sup>d</sup>	0.0 <sup>d</sup>		
	45	Meal substitute	0.0	0.0	0.1	0.0	0.0	0.0	0.0 <sup>d</sup>	0.0 <sup>d</sup>	
12	Eggs	0.0	59.0	24.3	0.0	48.2	18.8	20.4	29.8		
	46	Eggs	0.0	59.0	24.3	0.0	48.2	18.8	20.4	29.8	
13	Non-alcoholic beverages	251.2	1435.2	858.9	331.2	1478.4	888.0	1435.2 <sup>b</sup>	1478.4 <sup>b</sup>		
	47	Tap water (as such, in beverages or recipes)	0.0	586.7	175.0	0.0	640.0	196.0	586.7 <sup>b</sup>	640.0 <sup>b</sup>	
	48	Mineral water	0.0	986.7	478.3	0.0	1040.0	498.3	841.9	836.6	
	49	Herbal tea, tea, coffee, and substitutes (decaffeinated)	6.7	266.7	135.4	1.8	271.7	137.9	6.7 <sup>c</sup>	1.8 <sup>c</sup>	
	50	Fruit and vegetable juices (without artificial sweetener)	0.0	125.0	32.0	0.0	133.3	31.2	0.0 <sup>c</sup>	0.0 <sup>c</sup>	
	51	Other soft drinks	0.0	113.3	38.1	0.0	106.7	24.6	0.0 <sup>c</sup>	0.0 <sup>c</sup>	
	14	Miscellaneous	0.0	8.0	3.3	0.0	8.0	3.3	0.0 <sup>c</sup>	0.0 <sup>c</sup>	
		52	Miscellaneous	0.0	8.0	3.3	0.0	8.0	3.3	0.0 <sup>c</sup>	0.0 <sup>c</sup>
15	Alcoholic beverages	0.0	386.7	161.1	0.0	173.4	56.7	0.0 <sup>e</sup>	0.0 <sup>e</sup>		
	53	Regular wine and substitute	0.0	280.1	101.4	0.0	120.1	35.6	0.0 <sup>e</sup>	0.0 <sup>e</sup>	
	54	Sweet wine, spumante, wine-based appetizers % liquor	0.0	13.3	4.5	0.0	0.0	2.0	0.0 <sup>e</sup>	0.0 <sup>e</sup>	
	55	Beer, cider, and substitute	0.0	166.7	55.1	0.0	66.7	19.1	0.0 <sup>e</sup>	0.0 <sup>e</sup>	

<sup>a</sup>Non-consumers included; <sup>b</sup>Portion of food at 90th percentile; <sup>c</sup>Portion of food at 5th percentile equal to 0 except for herbal tea, coffee, and substitute; <sup>d</sup>Set to zero since both 5th and 90th percentile are equal to zero; <sup>e</sup>Set to zero in order to avoid the consumption.

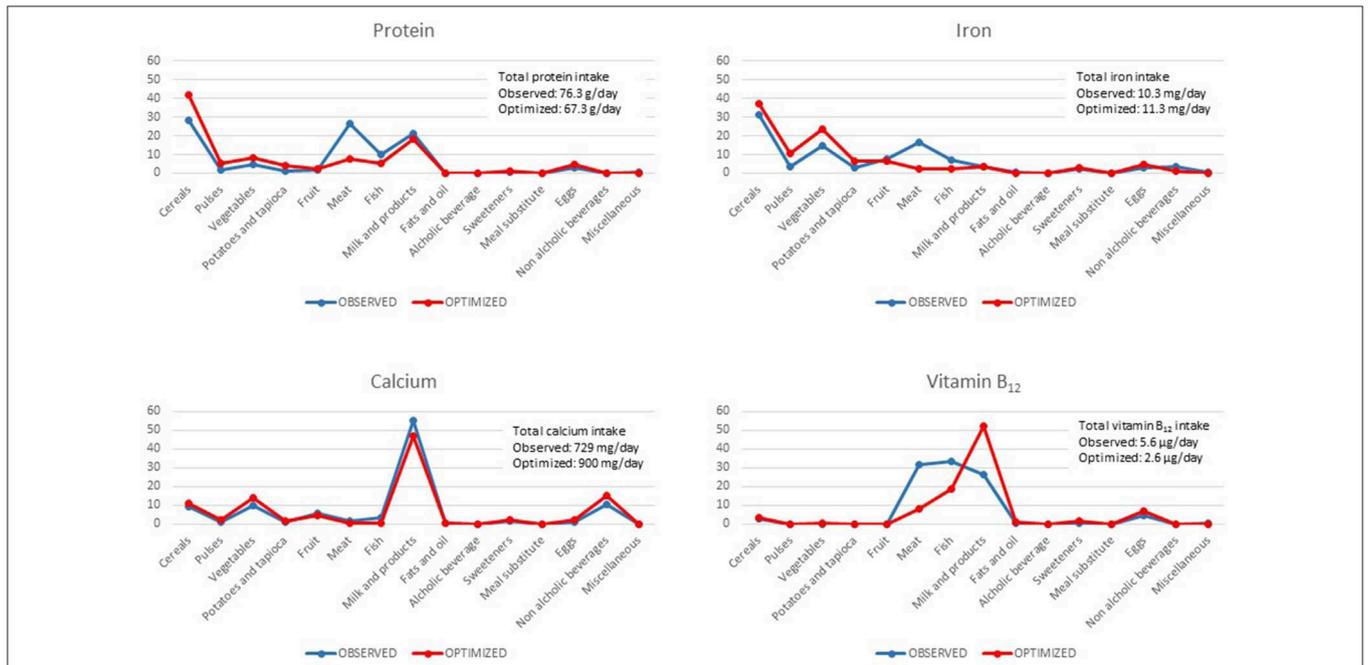
climate impact of the optimized diet resulted, indeed, to be lower than that of mean Italian dietary intake, that is, 1.9 vs. 4.0 kg CO<sub>2</sub>e/day for males, and 1.6 vs. 3.2 kg CO<sub>2</sub>e/day for females. This means a reduction of emissions of 43% for males and for 50%

females with acceptable changes in food consumption pattern and attaining nutrient recommendations.

Macdiarmid et al. (34) performed a similar study on UK female population data obtaining a 36% of GHGEs reduction



**FIGURE 1 |** Percentage contribution of food categories to total intake of selected nutrients (protein, iron, calcium, and vitamin B<sub>12</sub>) in observed and optimized diet in the male adult population.



**FIGURE 2 |** Percentage contribution of food categories to total intake of selected nutrients (protein, iron, calcium, and vitamin B<sub>12</sub>) in observed and optimized diet in the female adult population.

by imposing nutritional and acceptability constraints. Moreover, the optimized diet required a shift from meat and high-fat and sweet food toward fruit and vegetables as well as starchy food. Meat consumption was reduced by 60% with respect to the national dietary levels while the consumption of dairy products remained unchanged.

Optimizing a diet according to the healthy constraints determines a reduction of meat consumption that in some cases (e.g., processed meat) implies a drastic dietary change, a very long-term process for the population. However, our data demonstrated that it is possible to optimize a diet including limited quantity of red meat (10.0 g/day for both males and females with a reduction of 85 and 80%, respectively, with respect to currently observed levels of consumption). The increase of poultry consumption for males (37%), necessary for the GHGE optimization, is also relevant from a healthy point of view (4, 6) as dietary guidelines suggest a shift from red meat to white meat, including poultry.

Despite the decrease in meat consumption, especially red meat, in the optimized diet, levels of iron intake in females increase by 10% (10.3 vs. 11.3 mg/day). This is possible because of the increment in the intake of pulses, vegetables, and cereals that are important food sources of iron, as observed by Sette et al. (48). The percentage of heme iron—absorbable form without recommended ranges of values—decreased in the diet optimized (3%) compared to that observed (10%) (data not shown in the table); therefore, adult females should adopt special attention in the choice of vegetables and foods rich in dietary enhancer (for example, vitamin C) of non-heme iron absorption (49). As previously reported, using an iron recommendation (4) (18.0 mg/day) for females did not make it feasible to find a solution for an optimized diet. This was a direct effect of the assumption that optimized diet should be acceptable, meaning not too different from the assessed habits. Italian adult females have a very low intake of iron (**Table 2**), well below the recommendation, so that calculation leading to an important increase in iron intake is not compatible with the model.

Cheese consumption decreases 69% (males) and 90% (females) in optimized vs. observed diet: a potential important modification that is however in line with recommendations considering that Italian people should reduce their consumption from five portions per week (9) to three portions per week (4). In the optimized diet, spices and herbs resulted in the 90th percentile in both males and females. This result represents a further convergence between requirements to achieve climate change mitigation and health outcome. In fact, several food-based dietary guidelines, including the Italians ones, pointed out the importance of replacing salt with spices and herbs as a strategy to reduce the incidence of high blood pressure and related diseases. In parallel, it is recommended to vary choices within spices and herbs in order to limit exposure to toxic components, e.g., methyl-eugenol in basil (50), naturally present in herbal products. This study provides a further contribution to previously similar researches, as it fosters a healthy diet with low GHGE without the total elimination of meat and dairy

foods from the diet. On the other hand, Italian habits are preserved as imposed by the acceptability constraints. In fact, the optimized diet proposes many basic foods that are usually included in the meal of the Italian population (pasta, potatoes, vegetables, nuts, milk, and yogurt). In addition, this study provides an evolution of the national food consumption database including also GHGE values for individual food processing, distribution, and retailing. Emissions after the retail phase, such as transports to the household, storing, and cooking, were not included, as well as waste management. On the other hand, a study performed in the UK estimating consumer-specific GHGEs indicated that transport to home, storage at home, preparation, and disposal might represent 16% of total food-related emissions and 2.7% of all GHGE (51). GHGE data in the present paper were developed as much as possible with country-specific estimations; in fact, more than 50% of GHGE data come from scientific or gray literature of heterogeneous studies, conducted under different LCA modeling hypotheses. Anyway, Bertolucci (38) showed that a database of GHGE values estimated with a hybrid method, combining input/output and LCA approaches with a dataset retrieved from literature, improves the quality of data for building a standardized representative national GHGE database for food products. Another possible limitation of this study may be that data collection occurred more than 10 years ago (2005–2006) and therefore they could not represent correctly current Italian dietary habits. Hence, the real effort to adopt the proposed healthy and environment friendly diet could be greater or lower than the one estimated in this study, depending on the increase/decrease of food consumption in certain food groups. This study, however, has established a valid methodology that can be used when updated GHGE values and new national food consumption data will be available.

Moreover, we must consider that comparing global trend at the main food group level has shown a generalized decrease of per-capita intakes (g/day), including meat intake, while an increase of fish and seafood and composite (semi- or fully ready-to-eat products) food intakes had been observed across the 1980–1984 (52), 1994–1996 (53), and 2005–2006 (9) surveys. This appears to confirm the feasibility of the optimization here carried out so the results are suitable to analyze future survey results to understand whether observed diet will converge to optimized values or not.

The present results are in line with indicators of compliance to policy goals for a sustainable and nutritionally valid food system (54) also highlighted in Europe by the Food Agenda 2030 (55). This is important because, to some extent, the paradigm of changing food system for environmental protection is reversed considering that the first action to achieve an impact on sustainability is to follow nutrition recommendations (56). Analysis to foreseen food systems scenarios in 2030 and 2050 also evidenced consumers to play a central role in shaping a future sustainable agri-food system (57, 58). These first results encourage research in extending optimization incorporating further aspects in a multidisciplinary concept of diet sustainability (59, 60) and possibly food safety (61) in a

worldwide context (62) linking nutrition and food system (63) in benchmarking Italian dietary patterns (27, 33).

## CONCLUSION

Diet optimization, using linear programming model, can translate nutrient-based recommendations into acceptable dietary patterns for Italian adult population determining moreover a positive mitigation of climate impact. In particular, a GHGE reduction of around 43% for males and 50% for females was obtained.

The most important results of this study are the alignment of healthy dietary patterns with climate change indicators and an acceptable selection of foods within the eating habits having less environmental impact while complying with nutritional needs. In fact, evidence from this paper suggests that dietary pattern with a reduced environmental impact in terms of GHGE is compatible with a healthy and acceptable diet for the Italian population; dietary patterns that adhered to dietary guidelines (as a whole, not only in part) were more sustainable than the population's current mean amount of dietary pattern intake. These results can be used as a pillar around which optimization is extended to incorporate further aspects in a multidisciplinary concept of diet sustainability in a country-specific context to consider social organizations, economic structures, and cultures.

Overall, these results support the hypothesis that pursuing diet-related goals can substantially contribute to achieving SDGs.

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## DATA AVAILABILITY STATEMENT

All datasets generated for this study are included in the article/**Supplementary Material**.

## AUTHOR CONTRIBUTIONS

MF, LB, LR, AD, SS, and DM have substantially contributed to conception and design. MF, LB, AD, and SS have given substantial contributions to acquisition of data and/or analysis. MF, LB, LR, AD, SS, and DM have given substantial contributions to interpretation of data. MF was responsible for article writing. MF, LB, LR, AD, SS, DM, RP, CLD, CL, and AT have contributed and everyone has given final approval of the version to be submitted and any previous revised version.

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## SUPPLEMENTARY MATERIAL

The Supplementary Material for this article can be found online at: <https://www.frontiersin.org/articles/10.3389/fnut.2020.00048/full#supplementary-material>

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**Conflict of Interest:** The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

The reviewer FV declared a past co-authorship with several of the authors MF and SS to the handling Editor.

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