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# Precision nutrition for type 2 diabetes in Benin: leveraging linear goal programming to optimize diets with emphasis on adequacy, affordability, accessibility, and culture

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**Background:** Nutrition and diet are critical to managing Type 2 diabetes (T2D). Low-income households often face challenges maintaining a healthy and balanced diet due to food insecurity, availability, and cost. To address this issue, we used a linear goal programming (LGP) model to develop nutritionally adequate, affordable, accessible, and culturally acceptable diets for persons with T2D in Benin, a French-speaking sub-Saharan country. The goal was to help persons with T2D manage their condition more effectively.

**Methods:** We compiled a robust list of local commonly consumed foods in Benin, and calculated their nutritional value using West African food composition tables and food costs per serving from a market survey. Using mathematical optimization techniques, we designed dietary plans that meet the daily nutrient intake recommended by the World Health Organization (WHO) to prevent chronic diseases in normal adults. While adhering to dietary constraints of T2D, we developed optimized diet plans with varying energy levels that meet all nutrient requirements while considering availability, acceptability, and budgetary constraints.

**Results:** Fifty-two food items and recipes were evaluated to create six low-cost daily menus. Menu 1 was the most affordable at CFA 1,127 (USD 1.88), providing 1890 kcal of energy, while Menu 6 was the most expensive at CFA 1,227 (USD 2.05), providing 1749 kcal. All the menus met the daily WHO minimum requirements for carbohydrates, fat, cholesterol, and fiber content, while other nutrients such as protein, vitamin C, and iron reached the upper limits of the acceptable value range.

**Conclusion:** Linear goal programming can be an effective tool in helping to obtain optimized adequate, accessible, and culturally acceptable diets at

minimal cost by interpreting and translating dietary recommendations into a nutritional model, based on local market prices.

KEYWORDS

adequate diet, acceptable diet, accessible diet, diet costs, linear goal programming, type 2 diabetes, Africa

## **1** Introduction

Sub-Saharan Africa (SSA) is currently experiencing a rapid increase in nutrition-related chronic diseases, particularly Type 2 diabetes (T2D), leading to significant health challenges and economic burdens (1, 2). By 2045, T2D rates are expected to rise by 129%, worsening the already high levels of complications and comorbidities and placing immense pressure on the healthcare system (3-6). The Republic of Benin, a French-speaking country in SSA, is also facing a similar trend. Within 7 years, T2D prevalence has surged by 76%, reaching 21.6% in some areas (7). The current healthcare system's focus on treatment rather than prevention has resulted in a 55.8% increase in diabetes-related disabilities between 2007 and 2017 (8, 9). Moreover, diabetes-related complications have led to alarmingly high mortality rates, estimated at 618 deaths per 100,000 for women and 430 deaths per 100,000 for men (10, 11). Additionally, the population of adults aged 45-65 is expected to rise by 64.8%, contributing to a future increase in T2D cases and healthcare costs (12).

The high rates of morbidity and mortality among persons with T2D in Benin are mainly due to their poor adherence to dietary guidelines (13–15). A healthy diet has proven to effectively improve glycemic control, reduce cardiovascular risks, and prevent complications by lowering body mass index (BMI), hemoglobin A1c (HbA1c), triglycerides, cholesterol levels, and blood pressure (16–18). However, only 20% of persons with T2D in Benin follow the dietary recommendations. Moreover, studies indicate that 20% of these individuals have normal energy intake, 75% have high carbohydrate intake, and 77% have abnormal protein intake (19, 20). In a recent study, limited access to healthy foods, difficulty translating recommendations into practice, lack of information about local foods, and cultural acceptance issues hindered dietary adherence (21). Therefore, providing culturally appropriate and practical dietary recommendations is crucial, considering the health, financial, and cultural challenges faced by those living with T2D in Benin (22, 23).

In this context, linear programming (LP) is a valuable mathematical technique to address Benin's dietary needs. It involves using an objective function and constraints to find values for decision variables. LP can help identify the most appropriate nutritional changes while also considering constraints such as regional food preferences, serving sizes, and cost (24). This approach has been proven to be effective in creating food-based dietary guidelines, especially for populations facing food security and cost challenges. LP can assess the feasibility of diets with multiple constraints without increasing diet costs, which aligns with nutritional goals for diabetes management (25–30). Its notable advantage lies in using the existing diet as a foundation, thus creating optimal diets with familiar foods. This technique is particularly well-suited to complex African environments where diverse variables and constraints must be considered (24–26).

Although LP has gained popularity in nutrition, most studies focused on optimizing diet plans for healthy and undernourished individuals in SSA (25-30). Previous regional studies used LP to create optimal dietary patterns based on nutrient-based recommendations (31, 32) and evaluate cost constraints (33, 34). These studies address accessibility and adequacy, two of the four A's of food security (35, 36). In addition, while LP is commonly used in Europe, the United States, and Asia, its application to Benin presents challenges due to the country's distinctive food intake patterns characterized by high-carbohydrate diets with limited consumption of fruits, vegetables, and whole grains (31, 37-39). Benin's unique dietary context makes it difficult to directly apply results from studies conducted in other regions. Furthermore, research on dietary patterns in SSA for T2D is lacking. To fill these gaps, this study aims to use linear goal programming (LGP) to develop nutritionally adequate, affordable, accessible, and culturally acceptable diets for persons with T2D. LGP is an extension of LP that addresses multiple objectives. It can provide a more realistic representation of real-world problems than LP, often used to optimize decision-making with independent and dependent variables (40). By optimizing diet plans based on the 4 A's food security framework (adequacy, acceptability, accessibility, and availability of foods), low-income persons with T2D can improve their dietary adherence and health outcomes.

## 2 Materials and methods

### 2.1 Data preparation

As a first step in developing affordable, accessible, and culturally acceptable diets that meet nutritional requirements, we followed the data preparation process outlined by Briend et al. (41). The process involved three steps as described in Figure 1: (1) listing all the necessary nutrient requirements, (2) listing the commonly consumed and locally available foods for the Benin population, and determining their nutrient contents and cost per serving, and (3) calculating the maximum intake of each food per meal.

### 2.1.1 Nutrient requirements

Dietary needs vary according to gender, age, weight, height, and daily activities. We used the World Health Organization's (WHO) recommended daily nutrient intake for normal adults to prevent chronic diseases, as outlined in Table 1 (42). The nutrients considered were energy, carbohydrates, protein, total fat, cholesterol, fiber, vitamin C, vitamin B6, vitamin B12, iron, zinc, calcium, potassium, sodium, and carotenoids. Total fats include visible fats such as cooking and salad oils, invisible fats found in plant foods like fruits, vegetables,



TABLE 1 Recommended daily nutritional intake to prevent chronic diseases.

Dietary factors	Goals (normal nutritional status)
	Man and woman
Energy	1800–2,200 kcal
Carbohydrates*	50-55%
Proteins*	12-15%
Total fat*	< 30%
Cholesterol	< 300 mg/d
Fiber (g)	20-35 g/d
Vitamin B6	>1.3 mg/d
Vitamin B12	>2.4 µg/d
Vitamin C	75–90 mg/d
Vitamin A, Carotenoids	700–900 µg/d
Iron (mg/d)	18-8 mg/d
Zinc (mg/d)	8–11 mg/d
Calcium (mg/d)	1,000 mg/d
Sodium (mg/d)	<1,500 mg/d
Potassium (mg/d)	2,600–3,400 mg/d
Fruits and vegetables	> 400 g

\*Percentage of total energy needs.

cereals, and nuts, and animal foods such as fish, eggs, meats, and milk products. We also include a minimum daily consumption of 400 grams of fruit and vegetables to promote a balanced and healthy diet (43).

# 2.1.2 Foods, nutrient contents, and cost per serving

We created a detailed list of commonly consumed and locally available foods in Benin. To compile this list, we conducted a thorough search of the literature on food consumption, food consumption patterns, dietary habits, and the frequency of food consumption in all three regions (North, Central, and South) of Benin using resources such as Google, Google Scholar, and PubMed. We carefully reviewed all available abstracts and obtained relevant articles. Additionally, we searched for Master's and doctoral theses related to food consumption in Benin in the Faculty of Agricultural Sciences (FSA) Library of the University of Abomey-Calavi, Benin. In total, we identified 16 studies conducted in the three regions of Benin. Ten of these studies examined food consumption patterns, dietary habits, and food consumption frequency, while the remaining six focused on food consumption through dietary surveys among 21 to 514 participants from different socio-economic statuses in rural and urban areas. Our review also considered national diet surveys conducted to develop Benin food-based dietary guidelines (25) and regional diet surveys to determine adherence to dietary recommendations among persons with T2D (8, 44, 45).

Based on the literature review, including additional information on food frequency patterns, most individuals in Benin ate breakfast, lunch, dinner, and sometimes evening snacks in urban areas (46). With this information, daily nutrient intake was estimated using the foods consumed during these three significant meals and evening snacks. A list of 52 commonly consumed items by the Benin population, both diabetic and non-diabetic, was used to curate food combinations for meal plans. Some foods and recipes were selected based on dietary reference intakes with a low glycemic index, as

TABLE 2 Common	y consumed	foods and	recipes use	d for diet	optimization
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Breakfast	Evening snacks	Lunch/dinner
Corn paste; Tomato sauce; Vegetable sauce (Fonman);	Fermented cassava (gari); Sugar;	Corn paste; Tomato sauce; White rice, cooked; Vegetable sauce
Corchorus olitorius L (crin-crin); Okra (Gombo); Cooked	Peanut aballs (Klui Klui); Grilled	(Fonman, vernonie, gboman); Amaranth leaves (crin-crin);
tilapia fish; Fresh cooked chinchard (silivi); Cooked lean	peanuts; Granulated fermented flour	Cooked tilapia fish; Fresh cooked chinchard (silivi); Cooked lean
lamb; Cooked chicken; White rice, cooked; Fermented corn	porridge; Fermented corn dough	lamb; Cooked chicken; Yam-couscous (Wassa-wassa); Pepper;
dough porridge; Sugar; Grilled peanuts; Granulated	porridge; Bean cake; Fresh Orange;	Cooked beans; Peanut oil; Palm oil; Local cheese; Fermented corn
fermented flour porridge; Fermented corn dough (akassa);	Fresh Pineapple; Fresh Banana;	dough (akassa); Tomato sauce (Moyo); Boiled yam; Pounded yams;
Tomato sauce (Moyo); Mixed rice and beans; Boiled chicken	Mango; Tea; Bean cake; Boiled	Ground nut stew; Cassava-pudding; Beans and rice; Yam dough
eggs; Local cheese; Sweetened wheat doughnut (yovodoko);	chicken eggs; Plain yogurt; Papaya	(Telibô); White wheat bread; Cooked chicken; Boiled cassava;
Bean cake (Akara); Oatmeal; Soja porridge; Evaporated		Watermelon; Mango; Pineapple; Avocado; Cassava-pudding (Eba);
unsweetened milk (peak); Fresh orange; Fresh banana; Fresh		Pasta; Salad.
papaya; Lemon juice without added sugar; White wheat		
bread; Cooked beans; Peanut oil; Millet/Sorghum porridge,		
unsweetened		

recommended by the WHO guidelines for persons with T2D (47–49). Fast foods and soft drinks were excluded from the list based on nutritionist observation and feedback. Table 2 lists foods and recipes for different food intervals. The 52 items were classified into foods and recipes for breakfast (30 items), lunch/dinner (36 items), and evening snacks (16 items). The same food items were recommended for lunch and dinner as they could be taken at either meal.

Due to the absence of a food composition table (FCT) in Benin, nutrient data for local foods and recipes were sourced from Mali and West African FCTs (50–52) and the online nutrient tracker CRON-O-Meter (53).<sup>1</sup> However, these sources provided incomplete data, lacking coverage for all commonly consumed local recipes. Consequently, a food consumption survey was conducted in Benin's three main regions to ascertain these recipes' ingredients and nutritional values. Given the incomplete information in African food tables, the study focused on energy requirements and 14 essential nutrients for individuals with normal nutritional status, assuming each person would receive 100% of the required nutrients from their diet.

In calculating food costs per serving, this study utilized the "Cost of the Diet" tool and conducted a market survey. The "Cost of the Diet" tool considers factors such as the World Food Composition Database, the World Health Organization's (WHO) recommended nutrient requirements for various groups, local food prices, and household compositions (54). As staple food prices rose 23.9% in SSA (55), a market survey in the three main regions collected three different prices per food item, including the highest and lowest across all vendors. Raw ingredient weights for cooked composite dishes were measured, and their costs were totaled to determine the overall cost of all ingredients.

### 2.1.3 Maximum intake of each food per meal

Some researchers and clinicians suggest that adopting a carbohydrate-reduced diet may enhance outcomes for persons with T2D, including improved glycemic control, weight loss, and decreased reliance on hypoglycemic medications. This approach has sparked discussions about the potential effectiveness of treating T2D with a carbohydrate-reduced diet, possibly leading to remission (56,

# 2.2 Linear goal programming diet planning model

The LGP diet model was developed to create optimized diet plans for persons with T2D in Benin. These plans aim to meet patients' energy and nutrient requirements while considering factors such as affordability, cultural acceptance, and local food availability. To achieve this, we used three types of constraints. First, energy and nutrient constraints were implemented based on the WHO's recommended daily energy and nutrient intake to prevent chronic diseases among normal adults (45, 47–49). Secondly, the maximum portion size for each type of food per meal was determined by relying on the Benin food-based dietary guidelines and low-carbohydrate recommendations for persons with T2D (25, 59). Finally, the model considered acceptability, availability, and cost as constraints by selecting local commonly consumed foods and low-cost diets based on a market survey conducted in the three main regions of the country. The LGP formulation is as follows:

$$\min z = \sum_{i} w_{i}^{u} \left( d_{iu}^{-} + d_{iu}^{+} \right) + w_{i}^{l} \left( d_{il}^{-} + d_{il}^{+} \right)$$
(a)

$$\sum_{t \in T} \sum_{m \in M} N_{mti} x_{mt} + d_{iu}^- - d_{iu}^+ = UG_i, \forall i$$
 (b)

1 https://cronometer.com/

<sup>57).</sup> However, most persons with T2D in Benin follow highcarbohydrate diets with low fruits, vegetables, and whole grains (31, 38, 39). To encourage better food choices, maximum amounts of each food type per meal were determined, aligning with Benin's Foodbased dietary guidelines (25), carbohydrate recommendations for diabetics (45–60 grams per meal and 15–20 grams per snack) (58), and expert advice. Portion sizes, calculated in grams and domestic measures, considered the nutritional composition of specific foods and adhered to the nutrition content criteria for one portion of each food group. Table 3 provides examples of foods and their recommended maximum intake per meal. A standard serving size was defined as a 250 mL bowl used to serve corn dough in Benin. A tablespoon (15 mL) and the palm or the thumb were also used as references for portion size.

#### TABLE 3 Illustrative foods and maximum intake per meal\*.

Food item	Weight (g)	Maximum intake per meal
Cereals		
Corn dough, non-fermented	185	1 bowl
Cooked white rice	220	1 bowl
Fermented corn dough (akassa)	185	1 bowl
Boiled macaroni	140	1 bowl
White wheat bread	60	1/2 bread
Tubers and roots		
Cooked yam	136	1 bowl
Yam dough ( <i>Telibô</i> )	175	1 bowl
Fermented cassava (gari)	85	1/3 bowl
Vegetables and vegetable sauces		
Tomato sauce	225	1 bowl
Tomato sauce +crincrin	200	1 bowls
Leafy vegetable sauce	160	1 bowl
Beans, nuts and seeds		
Cooked white beans (white niébé)	125	1 bowl
Soya porridge, unsweetened	200	1 bowl
Grilled peanuts	19	1/2 bowl
Fruits		
Fresh papaya	95	1 bowl
Fresh banana	75	1 medium
Fresh orange	100	1 medium
Fresh mango	82.5	1 small or 1/2 large
Dairy products		
Evaporated unsweetened milk (peak)	85	1/2 milk box
Local cheese	50	The length of two thumbs
Traditional yoghurt	125	1 small container

\*Bowl represents 250 mL.

$$\sum_{t \in T} \sum_{m \in M} N_{mti} x_{mt} + d_{il}^- - d_{il}^+ = lG_i, \forall i$$
 (c)

$$\sum_{m \in M} x_{mt} = A_t, \forall t \tag{d}$$

$$d_{iu}^{-}, d_{iu}^{+}, d_{il}^{-}, d_{il}^{+} \ge 0, x_{mt} = \{0, 1\} \forall i, t, m$$
(e)

Sets and indices:

 $i \in I$ : set of nutrients and energy.

 $t \in T$ : set of type meals.

 $m \in M$ : set of meals.

Decision variables:

 $d_{iu}^-, d_{iu}^+$ : under-achievement and over-achievement of each nutrient and energy (*i*) from upper bound.

 $d_{il}^-, d_{il}^+$ : under-achievement and over-achievement of each nutrient and energy (*i*) from lower bound.

 $x_{mt} \in \{0,1\}$ : 1, if the meal (m) in type meal (t) is selected for menu, otherwise 0.

### Parameters:

 $w_i^{\mu}$ : The weights for upper bounds in nutrients and energy (*i*).  $w_i^{l}$ : The weights for lower bounds in nutrients and energy (*i*).  $N_{mti}$ : Nutrient and energy (*i*) value in meal (*m*) with type meal (*t*).  $A_t \in \{0,1\}$ : 1, if type meal (*t*) should be in menu, otherwise 0.  $UG_i$ : Upper bound for nutrient and energy (*i*) in menu.  $IG_i$ : Lower bound for nutrient and energy (*i*) in menu.

The objective function (Eq. a) minimizes deviations from nutrient and energy goals. The coefficients assigned to deviational variables in the objective function serve as indicators, reflecting both the significance and desirability of deviations from different nutrient and energy goals. Constraints (Eq. b) and (Eq. c) utilize goal programming constraints to ensure the attainment of specific goals for each nutrient and energy. Constraint (Eq. d) specifies that each type of meal should be either considered or not in the menu. Furthermore, constraint (Eq. e) ensures that decision variables adhere to defined domains.

TABLE 4 Six opti	mal diabetic menus	using LGP for ade	quate calorie intake a	it minimal cost.

Caloric intake	1890	1,359	1,228
Meal	Model 1	Model 2	Model 3
Breakfast	Cooked beans (1 bowl)	Beans and rice (1 bowl)	White bread (1/2 baguette)
	Peanut oil (1 tablespoon)	Tomato stew (1/2 bowl)	Boiled chicken eggs (2 pieces)
	Bread (1/2 baguette)	Grilled fish (56g)	Raw vegetables (1/2 bowl)
	Lemon juice (1 bowl)	Orange (1 medium)	Water (1 cup)
	Water (1 cup)	Water (1 cup)	
Lunch	Yam flour (1 bowl)	Cooked beans (1 bowl)	Wassa wassa (1 bowl)
	Tomato sauce+ crincrin (1 bowl)	Peanut oil (1 tablespoon)	Piment (1/2 bowl)
	Grilled fish (56g)	Pain (1/2 baguette)	Poisson fume (56 g)
	Water (1 cup)	Water (1 cup)	Water (1 cup)
Afternoon snack		Tea (+unsweetened sugar)	
Dinner	Vegetables salad with cooked eggs (2 bowls)	Macaroni (1 bowl)	Akassa (1 bowl)
	Bread (1/2 baguette)	Tomato sauce (1 bowl)	Tomato sauce (1 bowl)
	Water (1 cup)	Boiled chicken eggs (2)	Grilled salmon fish (56g)
		Water (1 cup)	Water (1 cup)
Total Consumption (kcal/day)	1889.6	1359.4	1228.17
Food cost per day (CFA)	1,127 (USD 1.88)	1,136 (USD 1.90)	1,184 (USD 1.98)

Caloric intake	2034	1,592	1749
Meal	Model 4	Model 5	Model 6
Breakfast	Beans and rice (1 bowl)Tomato stew (1/2 bowl) Grilled fish (56g) Orange (1 medium) Water (1 cup)	Millet/Sorghum porridge (1.5 bowl) Bean cake, Akara (2 small pieces) Orange (1 medium) Water (1 cup)	Non-fermented corn dough porridge (1.5 bowl) Sweetened wheat doughnut (2 small pieces) Water (1 cup)
Lunch	Cooked beans (1 bowl) Peanut oil (1 tablespoon) Bread (1/2 baguette) Water (1 cup)	Yam flour (1 bowl) Tomato sauce+ crincrin (1 bowl) Grilled fish (56g) Water (1 cup)	Fermented corn dough, akassa (1 bowl) Tomato sauce, Moyo (1 bowl) Boiled fish (56 g) Papaya (1 medium) Water (1 cup)
Afternoon snack		Grilled peanuts (1/4 bowl)	Orange (1 medium)
Dinner	Rice (1 bowl) Tomato sauce (1 bowl) Grilled Fish (56 g) Water (1 cup)	Akassa (1 bowl) Tomato sauce (1 bowl) Grilled salmon fish (56 g) Water (1 cup)	Rice (1 bowl) Vegetables sauce (1 bowl) Cooked meat (beef) (56g) Water (1 cup)
Total Consumption (kcal/day)	2033.570	1591.577	1748.940
Food cost per day (CFA)	1,220 (USD 2.04)	1,223 (USD 2.02)	1,227 (USD 2.05)

## 2.3 Data analysis

In this study, the tests were conducted on a MacOS with one Apple M1 chip and 8GB RAM. We solve the LGP proposed using Python 3.10.3 and optimization solver Gurobi 9.1.2.

## **3** Results

Six of the 15 optimized menus generated using LGP had the lowest costs with various energy levels that fell within the lower and upper limits set for kcal (1800–2,200 kcal) as shown in Table 4. Menu

1 had the lowest cost of CFA 1,127 (USD 1.88) with an energy level of 1890 kcal, while Menu 6 has the highest price of CFA 1,227 (2.05 USD) with an energy level of 1749 kcal. Moreover, most of the foods included in the six models are whole grain foods such as millet, sorghum, and maize; vegetables like *C. olitorius* (crin-crin), spinach, and tomato; fruits like oranges, papayas, and lemons; and foods from animal sources such as eggs, fish, and meat. Most of the cooking methods used were steaming, baking, or grilling.

All six menus also met the constraints' upper and lower limits, including the recommendations for macronutrients and micronutrients, as displayed in Table 5. The values for carbohydrates, fat, cholesterol, and fiber have reached the constraints' lower limits.

		Menu 1: Calorie: 1890	Menu 2: Calorie:1359	Menu 3: Calorie: 1228	Menu 4: Calorie:2034	Menu 5: Calorie:1592	Menu 6: Calorie 1749
	Goals	Consumption	Consumption	Consumption	Consumption	Consumption	Consumption
Carbohydrates (g)	50-55%	173.05 (37%)	88.73 (26%)	97.78 (32%)	229.92 (45%)	92.78 (23%)	166.53 (38%)
Protein (g)	12-15%	75.76 (16%)	46.30 (14%)	72.27 (24%)	65.29 (13%)	50.93~(13%)	49.55(11%)
Fat (g)	<30%	43.95 (21%)	20.10 (13%)	34.40 (25%)	55.53 (25%)	29.51 (17%)	74.55 (38%)
Cholesterol (mg)	<300 mg/d	161.30	81.96	362.59	155.08	81.96	94.63
Fiber (g)	20-35 g/d	20.20	28.94	26.37	23.56	20.54	22.63
Vitamin A, beta-carotene	>700-900 μg/d	403.13	1349.65	546.98	502.04	1349.65	799.22
Vitamin B6 (mg)	>1.3 mg/d	1.55	0.89	1.20	0.89	0.99	1.22
Vitamin B12	>2.4µg/d	11.88	17.45	18.68	10.98	17.45	7.72
Vitamin C (mcg)	75–90 mg/d	126.84	126.74	129.75	171.25	126.74	151.78
Iron (mg)	18-8 mg/d	22.23	22.57	12.85	12.25	22.87	24.80
Zinc (mg)	8-11 mg/d	7.73	42.44	5.83	5.92	42.97	7.10
Calcium (mg)	1,000 mg/d	324.66	202.25	223.64	241.69	213.27	255.77
Potassium (mg)	<1,500 mg/d	1365.41	1475.83	1396.20	1540.77	1596.29	1074.30
Sodium (mg)	2,600–3,400 mg/d	1400.27	1516.98	1630.51	1465.39	1518.12	1778.66

TABLE 5 Nutritional information of the six optimal menus at the lowest cost based on different caloric intake

However, other nutrients such as protein, vitamin B12, vitamin C, and iron have reached maximum acceptable levels.

Finally, out of the 56 recipes commonly consumed and available locally in Benin, six menus had an average of 10 recipes. Menu 1 contained 9 recipes with 1890 kcals of energy. Menu 2 had 11 recipes with 1,359 calories. Menu 3 consisted of 9 recipes with 1,228 Kcals. Menu 4 and Menu 5 had 11 recipes with energy levels of 2034 and 1,592 kcals, respectively. Lastly, menu 6 included 9 recipes with an energy level of 1749 calories, as shown in Figure 2.

## 4 Discussion

Type 2 diabetes (T2D) is increasing in SSA, including Benin, and culturally appropriate and practical dietary recommendations are urgently needed. In the findings, six of 15 optimized menus created through LGP achieved the lowest costs while meeting energy levels between 1800 and 2,200 kcal/day. Specifically, Menu 1 had the lowest price of USD 1.88 at an energy level of 1890 kcal. Despite Models 5 and 6 having lower energy levels, they incurred higher costs of USD 2.02 and USD 2.05, respectively. The six menus predominantly featured whole grains, vegetables, fruits, and animal sources prepared through steaming, baking, or grilling and met upper and lower constraints for nutrients, aligning with dietary recommendations. In addition, the study showcased practicality by compiling an average of 10 recipes per menu from 56 locally available options in Benin, emphasizing diversity in the proposed diabetic menus. Therefore, the study offered feasible solutions to energy and dietary issues by balancing nutritional needs with acceptability, accessibility, and budget limitations. It also suggested that alternative menu combinations could be explored by replacing food recipes with similar nutrient sources in these optimization models. Additionally, food recipes can be adjusted based on diabetes patients' sugar levels to ensure energy balance (27). As a result, this study assists in managing glucose levels through optimized food menus and encourages a healthy lifestyle for individuals with T2D in Benin or similar environments.

The dietary patterns were modeled based on WHO-recommended daily nutrient intake as constraints. In contrast, other researchers have used more American criteria such as EAR, adequate intake, UL, RDA, or RDI (28, 39, 60-62). Our decision to follow the WHO recommendations was justified because they have been proposed to reduce risk factors for chronic diseases resulting from unhealthy diets and physical inactivity through public health efforts in SSA (42). Additionally, by meeting the higher micronutrient objectives, the modeled diet fulfilled all the requirements for this population, which were low in previous observed amounts (8, 44). Moreover, supplementation with fiber, calcium, iron, vitamin C, and vitamin A would enable individuals to meet their dietary needs if the proposed diet was not adopted. However, individuals should strive to meet their nutrient requirements through healthy eating patterns that include nutrient-dense foods as highlighted in this study. Conversely, unlike studies among persons with T2D in Benin (8, 44), our modeled diets lowered sodium and potassium without increasing the cost. Consequently, the prevalence of high blood pressure and heart disease, two main concerns for diabetes patients, could be reduced (63, 64).

Furthermore, little improvement to the existing diet has been achieved by increasing the consumption of functional foods that effectively treat and prevent diabetes (65). These foods include whole



grains (millet and sorghum), rich in fiber; vegetables (crincrin and spinach), rich in fiber, minerals, and vitamins while low in calories; fruits (orange and papaya), packed with fiber, vitamins, and antioxidants; and food from animal sources, rich in proteins. They also contain bioactive compounds that help manage diabetes (66). Moreover, the menus emphasize low glycemic index foods like akassa (GI 18), green vegetable soup (GI 25), akara (GI 43.7), and rice and tomato soup (GI 46.3). Sugary drinks are avoided except for naturally occurring sugar in fruits and vegetables (67-69). Healthy, highantioxidant drinks such as lemon and orange juice are recommended alternatives. Lean proteins like beans, fish, and peanuts are suggested as protein sources. Further, as per Asmaa et al. (70), the recommended menus stress reducing saturated and trans-fats by utilizing cooking methods like steaming, baking, or grilling, which reduce meal fat content. High intakes of fats and cholesterol have been associated with a higher risk of CVD and diabetes, so lowering this could also improve their health (66-68). However, communication with health workers and dietitians will be essential to promote healthier alternatives to individuals while making them more available (increased physical and economic access) in community stores and markets.

We aim to produce an adequate, accessible, and culturally acceptable diet that helps to manage T2D so that it is affordable and achievable for low-income individuals. In the study, energy levels were categorized into three ranges: 1200–1,600 kcal per day, 1,600–1800 kcal per day, and 1800–2,200 kcal per day, ideal for overweight or obese patients. Managing T2D in SSA is challenging due to individuals being overweight at diagnosis and gaining weight during treatment (2, 65, 71–73). Dietary plans should focus on reducing energy intake while ensuring optimal nutrient consumption. The carbohydrate values are now at the lowest limit. Previous studies have shown that very low-carbohydrate diets (20% or less of total calories) and low-carbohydrate diets (40% or less of total calories) can improve outcomes for T2D, including weight loss, better glycemic control, and reduced use of hypoglycemic medications (74–76). In addition, while budget constraints remain

a concern because of food price rises, our optimized diets maintain a minimum cost within a specific range that, in this study, is below USD 2.05 each day, including three or four main meals. However, we did not apply a cost constraint to our models since previous research has shown that it can adversely affect diet nutrient density and food selection (24). We selected commonly consumed and easily accessible foods. Identifying affordable food patterns that provide the necessary nutrients can help reduce social inequalities, such as those in Benin. However, it is also critical to address the underlying causes of food insecurity and dietary inadequacy in the country.

However, this study had some limitations. The selection of optimal food recipes is limited to T2D patients without significant complications. However, optimization models can be used to extend this study to patients with other comorbidities, such as gestational diabetes, hypertension, cardiovascular disease, and other chronic illnesses. Moreover, we assumed that all food prices were based on purchases made at markets or street vendors without considering cooking costs or removing non-edible portions. The diet cost may have been underestimated for home-prepared food bought as readyto-eat meals, and conversely, ready-to-eat food prepared at home may have been overestimated. While acknowledging the study's limitations, it is notable for its comprehensive approach, targeting urban and rural populations across the three main regions of Benin. The selected foods for optimization are readily available, accessible, and culturally acceptable, rendering the food intake data representative of the general population. Moreover, the study employs domestic measurements to convey servings in easily understandable amounts, potentially improving compliance with recommended portion sizes and numbers (71). Furthermore, adding locally cooked recipes with food composition data from a survey in Benin's three main regions strengthens the study's foundation. Our next steps are to evaluate the proposed diets among 30 people with T2D after appropriate training. We will create user-friendly guidance for using the menus and address other lifestyle factors. Evaluation will include pre- and post-diet measurements of weight and HbA1c.

## **5** Conclusion

This study underscores the potential of LGP as an effective tool for crafting affordable, culturally acceptable, accessible, and nutritionally adequate diets tailored to the needs of individuals with T2D in Benin, a Francophone SSA country. Leveraging local market prices, this method transforms dietary recommendations into an optimized nutritional model at minimal cost. The focus on selecting food recipes with low carbohydrate and fat content while meeting all essential nutrients for diabetes patients holds crucial significance for menu development. By identifying widely available food recipes and alleviating the economic burden on Benin's population, this research provides a valuable resource for T2D patients, offering an ideal menu to sustain a healthy lifestyle at a reduced cost.

## Data availability statement

The data that support the findings of this study are available on request from the corresponding author.

## Author contributions

HA: Conceptualization, Data curation, Formal analysis, Funding acquisition, Investigation, Methodology, Project administration, Resources, Software, Validation, Writing – original draft, Writing – review & editing. MM: Data curation, Formal analysis, Methodology, Software, Writing – original draft, Writing – review & editing. CM-A: Conceptualization, Methodology, Writing – original draft, Writing – review & editing. AO: Conceptualization, Methodology, Writing – original draft, Writing – review & editing. WAH: Conceptualization, Formal analysis, Funding acquisition, Investigation, Methodology, Supervision, Validation, Writing – original draft, Writing – review & editing. EB: Conceptualization, Funding acquisition, Methodology, Supervision, Validation, Writing – original draft, Writing – review & editing. JG: Conceptualization, Methodology, Writing – original draft, Writing – review & editing. NF: Conceptualization, Methodology,

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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.

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