CS3263 – Foundations of Artificial Intelligence
Term Project Report

SmartFridge, an AI agent that recommends the best recipe for you

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1 Introduction

1.1 Motivation

Research has shown that households often waste food because expiration dates are overlooked and meal planning is not done systematically. The amount of avoidable food waste is equivalent to each household throwing away a 2.5kg bag of rice every week. And over half such waste can be reduced if meals are better planned. Recognizing this issue, our team aims to develop an AI-driven solution. An AI-driven menu suggestion system can address this challenge by tracking food items, reasoning about their freshness, and proposing meal options that prioritize ingredients with shorter expiration dates.

1.2 Project Scope

Our solution contains the following features

- Keep track(Add/Delete) food items from the fridge

- Keep track(Add/Delete) recipes from a recipe book

- Recommend the most suitable recipe from the recipe book

1.3 Techniques Used

The recommendation is simulated by a decision-making process to decide which recipe to recommend. A decision tree is constructed to solve this problem. The parameters of the decision tree can be categorized into two types. Two Bayesian networks are implemented to calculate the feasibility of the recipe and probabilities of expiration of food items. The utility function for each recipe is calculated using an unsupervised machine learning model.

1.4 Terminology & Notations

For clarity, the main symbols and assumptions used in this report is defined below:

- $\mathcal{F} = \{f_1, f_2, \ldots, f_n\}$ denotes the set of food items available and currently stored in the fridge.

- Each food item f_i is associated with food names $f\_name_{f_i}$ days in the fridge $days_{f_i}$, food type fty_{f_i}, storage type sty_{f_i}.

- $\forall fty_{f_i}, fty_{f_i} \in FT, FT = \{\text{CANNED}, \text{VEG\_OR\_FRUIT}, \text{MEAT}\}$. To simplify the problems, we only focus on these three types of food.

- $\forall sty_{f_i}, sty_{f_i} \in ST, ST = \{\text{REFRIGERATE}, \text{FROZEN}, \text{NORMAL\_TEMP}\}$. Similarly, we limit the scope of the discussion to only these three types of storage.

- $\forall f\_name_{f_i}, f\_name_{f_i} \in \mathcal{N}$, $\mathcal{N}$ is the set of food names available in the fridge.

- $\mathcal{M}$ is the set of recipes r_i that will be available for users. A fixed set of recipes has been redefined with its relevant attributes.

- Each recipe r_i has an unique attribute of recipe name $rname_{r_i}$.

- Each recipe r_i has a requirements in form of a set of names of the required food items $\mathcal{R}_{r_i} = \{f\_name_F | f\_name_F \in \mathcal{N}\}$.

- Each recipe r_i has a corresponding list of tags $\mathcal{C}_{r_i}$, which will be then used in determining the desirability of a recipe.

- We assume the quantity of food available in the fridge is sufficient for any recipe that required this food as part of the ingredient requirements.

2 Bayesian Network Inferencing

The probability of successfully making the recipe depends on various foods available in the fridge. In order to infer the probability of the success, a Bayesian Network is used for modeling.

2.1 BN structure

This can be seen from the picture Figure 1

2.2 Learning

2.3 BN reasoning

3 Utility theory

Refer to textbook Russell and Norvig (2020)

3.1 Utility Formulae

$i \leftarrow 10$
if $i \geq 5$ **then**
    $i \leftarrow i - 1$
else
    if $i \leq 3$ **then**
        $i \leftarrow i + 2$
    end if
end if

3.2 Learning for utility

4 Decision Making

Aim to maximize the expected utility of a recipe.

$$\text{MEU} = \max_{a \in A} \mathbb{E}[U \mid a] = \max_{a \in A} \sum_{s} P(s \mid a)\, U(s, a)$$

4.1 Decision Network

4.2 Decision Making Process

5 Future Improvement

5.1 Machine learning loopholes

5.2 Reinforcement Learning

Appendix 1   algorithms

- algorithms demo:

  $i \leftarrow 10$
  if $i \geq 5$ **then**
      $i \leftarrow i - 1$
  else
      if $i \leq 3$ **then**
          $i \leftarrow i + 2$
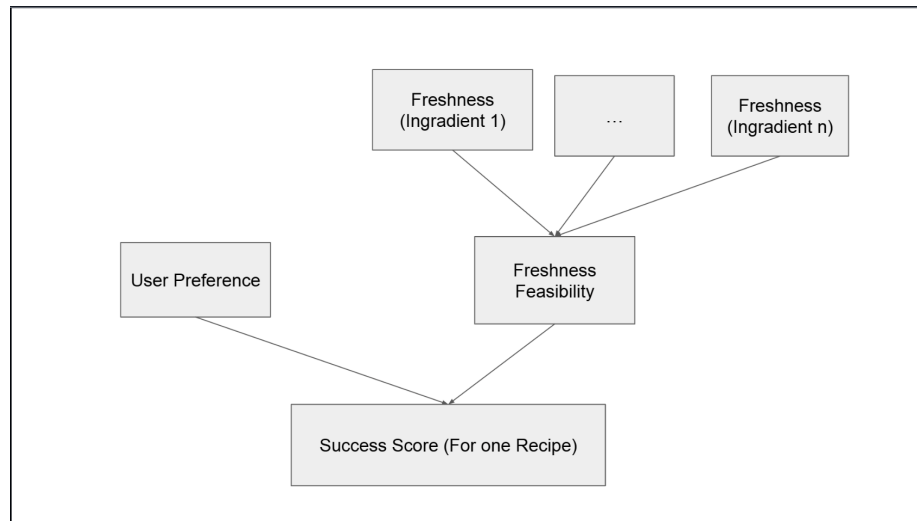   **end if**
  end if

Appendix 2 diagrams

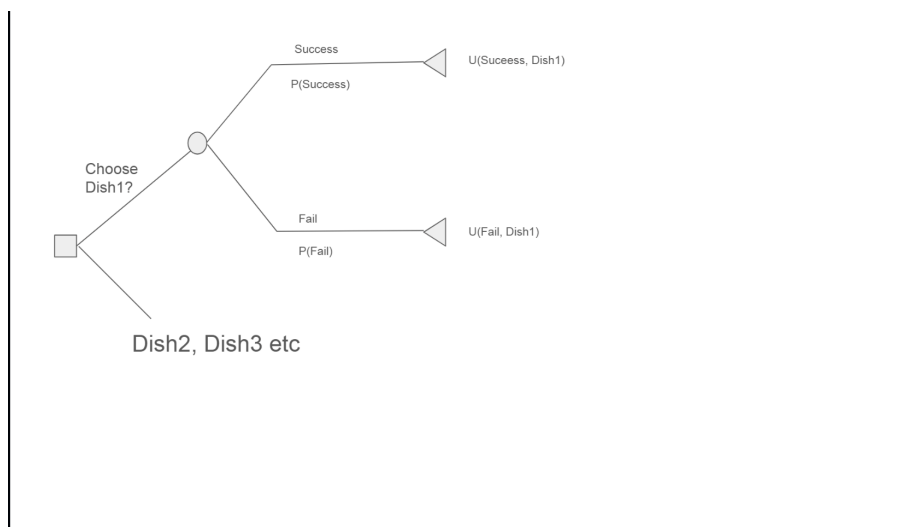Figure 1: Bayesian Network structure

Figure 2: Decision Network structure

Bibliography

Stuart Russell and Peter Norvig. 2020. *Artificial Intelligence: A Modern Approach* (4th ed.). Pearson, London.