Team Control Number



Problem Chosen



2020 HiMCM Summary Sheet

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# Ranking Algorithm of Summer Job Recommendation Based on Graph Distance

Abstract

We conducted a sampling survey of high school students in Beijing, China, to get their real ideas about "what factors should be considered when looking for a summer job". Based on the data obtained from the survey, we use the method of hypothesis test to determine the factors that should be considered when selecting summer jobs.

We use three feature radar charts (Situation, Capability, Characteristic & Requirement) to show high school students' situation and preference. We construct 17 quantitative indicators to measure the features of persons and jobs, and we use graph distance to describe how well personal preferences fit into job requirements. The model will rank the recommended jobs according to a comprehensive evaluation index.

We use the real data from survey to construct 10 fictional persons to do model testing. The results show that the algorithm can recommend the work they like or are good at according to their personal situation and preference. In most cases, the model will recommend jobs that are easy to master and do not require specific skills, such as waiter, cashier and courier. In model generalization, we discuss in detail how to expand our open model.

The real data from our survey makes our model and test more reliable. Moreover, we design the final algorithm as webpages, which make recommendation more intelligent and humanized. The webpages give the recommended ranking of summer job options. For the recommended job, it will tell you what to do to prepare and how to improve yourself. The webpages can also tell you the nearest workplace, working hours per week and how much salary you will be paid.

**Keywords:** sampling survey, hypothesis test, feature radar chart, graph distance

# **Contents**

1.	Introduction	2
	1.1. Restatement of the Problem	2
	1.2. Our Work	2
2.	Model Assumptions	2
3.	Notations	3
4.	Factors We Should Consider	3
	4.1. A Survey about Summer Job Options	3
	4.2. Statistical Results of the Survey	3
	4.3. Conclusion We Achieve	5
5.	Evaluation Model of Summer Job.	6
	5.1. Feature Radar Charts	6
	5.2. Measurement Based on Graph Distance	8
6.	Test Model with Fictional Persons	0
	6.1. Urban Occupation Distribution Map	0
	6.2. Fictional Person Constructed According to Our Survey	11
	6.3. Model Test and Results Analysis	13
7.	Apply the Model to the Webpage	5
8.	Generalization	8
9.	Reference 1	9
10.	Attachment	20

## 1. Introduction

#### 1.1 Restatement of the Problem

A good summer job can help us develop ability, increase experience and enrich our résumé, while a summer job that is not suitable for us may only waste time and energy. Therefore, it is quite important to choose the most valuable and suitable one from many options according to our own situation and preferences. We need to complete the following tasks:

- Figure out factors high school students looking for a summer job should consider.
- Based on factors we find, develop a model to evaluate summer job options.
- Use fictional person to verify the rationality and reliability of our model.
- Design our model as an easy-to-use app or web page.

#### 1.2 Our Work

In order to get the real ideas of high school students about summer job selection, we designed a survey to gather samples and information. In the survey, we set up some factors in advance and asked high school students to choose how much they care about these factors. We also collected their preferences, situations, personal abilities and other factors they will consider when looking for a summer job. This makes our analysis more reliable.

As for the core model, we use several radar charts to show high school students' situation, preference and mastered skills. We quantify the characteristics, capabilities and requirements required by various jobs into the same radar chart index. We construct a measure to describe how well personal preferences fit into job requirements, and then give the ranking of summer job options.

The real data from our survey help us to create fictional persons to test our model. Moreover, we design the final algorithm to make recommendation more intelligent and humanized. The algorithm gives the recommended ranking of summer job options. For the recommended summer job, it will tell you what to do to prepare and how to improve yourself. The algorithm can also tell you the nearest workplace, working hours per week and how much salary you will be paid.

# 2. Model Assumptions

- 1. It is assumed that the samples in the survey are randomly selected. The characteristics of the samples can represent the characteristics of the population.
- 2. It is assumed that the survey is true and effective and can reflect students' correct situation and personal preference.
- 3. It is assumed that the samples extracted from survey are independent and identically distributed.
- 4. It is assumed that the situation and preference of high school students can be quantified.
- 5. It is assumed that he working market is balanced, the salary of all the staff should fluctuate around the balance point, which means that it's reasonable to use the mean value of the salary to represent the salary job can give.

#### 3. Notations

Symbol	Description
$P_{(factor)}$	The proportion of factor scores exceeding 2
$H_0, H_a$	Null hypothesis and alternative hypothesis
α	The level of significance of the testing
$X_{job}^{(feature)}$	Numerical level of job features after quantification
$X_{student}^{(feature)}$	Numerical level of personal features after quantification
$d_{iob}^{(feature)}$ Graph distance of job features in radar chart	
$\overline{w}$	Weight vector for weighted sum of graph distances
$w_{(feature)}$ The weight of each feature	
$M_{job}$	Comprehensive evaluation index of job

#### 4. Factors We Should Consider

## 4.1 A Survey about Summer Job Options

To figure out what factors high school students who are looking for a summer job should consider and make sure the factors we list can accurately reflect the true situation of the students, we design the survey mentioned in Chapter2 and conduct it on 264 students from a high school in Beijing, China.

In the survey, we firstly assume that the targeted students are selected randomly and uniformly, and that the behavior of these samples can finely represent that of the population. Considering the situation of the high school students looking for a summer job and some characteristics of most common jobs, we set up a series of questions to investigate the students' motivation and their specific demands for the job. In this way, we can directly compare the significance of the potential factors and analyze how these factors affect the students' decision.

# 4.2 Statistical Results of the Survey

After collecting all the information from the survey and dropping the invalid data, for each question, we count the number of people in favor of every option accordingly. Then we observe the numbers and analyze them from statistical perspective. To give a explicit and direct knowledge of the result of our survey, we display our analysis process in the form of charts or sheets as follow.

In the survey, we have given 11 factors that high school students may need to consider when choosing summer jobs. We use five quantitative scores (1 to 5 Points) to measure how much they value these factors.

1-Point means they don't care this factor at all, and 5-Point means they care it very much. In addition, if the factors they want to consider are not available, they can fill in other factors and tell us, so that we can find the common characteristics of the factors not considered from the survey. The score distribution of each factor is shown below:

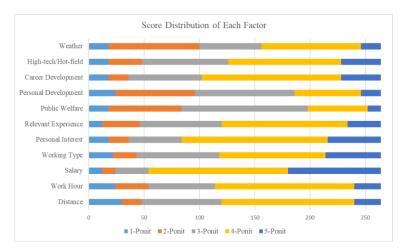


Figure 1: Score Distribution of Each Factor

We assume that: If the number of factors with 3 or more scores is statistically well-documented, we think that this factor should be considered when high school students choose summer jobs. Therefore, we calculate the proportion of each factor score more than 2 points, and then use the hypothesis test method to draw a conclusion.

Let  $P_{(factor)}$  denote the proportion of factor scores exceeding 2 and let  $p_0 = 0.75$ , We construct the null hypothesis  $H_0$  and alternative hypothesis  $H_a$  as follows:

$$H_0: P_{(factor)} \ge p_0 \text{ v.s. } H_a: P_{(factor)} < p_0,$$
 (1)

In our survey, the sample size is n = 264. We construct the following normal statistics Z:

$$Z = \frac{\overline{P} - p_0}{\sqrt{\frac{p_0(1 - p_0)}{n}}},\tag{2}$$

Notice that  $np_0 = 198 \ge 5$ ,  $n(1 - p_0) = 66 \ge 5$ , Under the condition that  $H_0$  is true, we can get the distribution of Z (or  $\overline{P}$ ) by central limit theorem:

$$\overline{P} \sim N\left(p_0, \frac{p_0(1-p_0)}{n}\right), \quad \text{i. e. } Z \sim N(0,1),$$
 (3)

From above, we can get the rejection region as:

RR: 
$$\overline{P} \in (0, P_L]$$
, with  $P_L = p_0 - z_\alpha \sqrt{\frac{p_0(1 - p_0)}{n}}$ , (4)

where  $\alpha$  means level of significance of the testing,  $z_a$  is the quantile of the standard normal distribution.

In our model, we set the level of significance of the testing  $\alpha = 0.05$  ( $z_{\alpha} \approx 1.645$ ). The rejection region of the problem is obtained:

$$RR: \overline{P} \in (0,0.7062] \tag{5}$$

When the proportion of a factor score more than 2 points falls into the rejection domain (i.e.  $\overline{P} \leq 0.7062$ ), we have enough statistical evidence to reject the null hypothesis  $H_0$ , then this factor should not be included in the selection of summer jobs by high school students. The proportion of each factor in our survey is calculated as follows:

Factor	Proportion	Factor	Proportion
Distance	0.8182	Public Welfare	0.6818
Work Hour	0.7954	Personal Development	0.6364
Salary	0.9091	Career Development	0.8636
Working Type	0.8371	High-tech/Hot-field	0.8182
Personal Interest	0.8636	Weather	0.6212
Relevant Experience	0.8258		

Table 1: Proportion of Each Factor Score Exceeding 2 Points

It can be seen from the above table that the proportion of "Public Welfare", "Personal Development" and "Weather" is less than  $P_L = 0.7062$ ,. Therefore, in the statistical sense, we think that they should not be considered when choosing summer jobs.

#### 4.3 Conclusions We Achieve

As the data and analysis showed above, we can have a comprehensive insight into the factors that may cast influence on the student's decision-making when faced with several summer job options. We list the factors, their descriptions and units in the following sheet.

Feature	Description	Unit	
Distance	How far is it from your home to the workplace	Kilometer	
Working Time	How long you have to spend on working every week	Hour	
Salary	How much each hour you will be paid	Dollar	
Allowance	How much pocket money can be used every week	Dollar	
Grade	Senior one, Senior two or Senior three	Levels	
Working Type	Involve more physical activity or is sedentary	Levels	
Relevant Experience	Whether you have done any relevant jobs or not	Yes or No	
Personal	Whether the work can improve your specific skill or	Yes or No	
Development	capability or not	res or No	
Career	Whether the work have a positive influence on your	Yes or No	
Development	further study or career or not	i es or No	
High-tech/Hot-field	Whether the work is closely linked to some high-tech	Yes or No	
Relevance	or hot fields or not	res or No	

Table 2: Factors High School Students Should Consider

#### 5. Evaluation Model of Summer Job

A suitable summer job not only needs to consider our own situation, but also, we need to have the interest to engage in related work. Meanwhile, jobs have different requirements on our personal abilities. For example, Physical activities (e.g. cashier, waiter) require more physical effort, while some sedentary jobs (e.g. researcher, programmer) require us to master specific skills. We use radar charts to show high school students' situation, preference and mastered skills, and construct a measure to describe how well personal preferences fit into job requirements, then we can give the ranking of summer job options.

#### **5.1 Feature Radar Charts**

Personal preferences and job requirements should match each other. In order to quantify characteristics of students and jobs, on one hand, we divide personal situation and preference into several quantitative indicators according to different dimensions, draw them as feature radar charts, and then use them as input features of the model on the one hand. On the other, we investigate the job's requirements on these indicators and give the feature radar charts of each job in advance.

Based on the factors obtained from the survey, the personal situation and preferences are divided into three categories: Situation, Capability and Characteristics & Requirement. Each of these categories contains several features. Each feature, according to our survey and investment, is quantified into a numerical level for model to use.

Features Descriptions
Grade Senior one, Senior two or Senior three
Allowance How much pocket money can be used every week
Rational The degree of ration
Emotional The degree of emotion
Distance Distance between workplace and residence

Table 3: Descriptions of Features in Situation

(The value of the Situation features is an integer between 1 and 3)

Features Descriptions

Skill Does the job require a specific skill (e.g. programmer)

Research Job's requirement on research ability

Art Job's requirement of work for art knowledge and creativity

Social Job's requirement on interpersonal skills

Management Job's requirement on organization and management ability

Conventional Is the job traditional or general (e.g. salesman)

Table 4: Descriptions of Features in Capability

(The value of the Capability features is an integer between 1 and 5)

Table 5: Descriptions of Features in Characteristic & Requirement

Features	Descriptions
Extraversion The degree of extroversion	
Introversion The degree of introversion	
Empirical	Whether the job require students to have a lot of experience or not
Work Hour	Working hours per week
PA or Sedentary Whether job require more physical or not	
Salary Hourly rate	

(The value of the Characteristic & Requirement features is an integer between 1 and 5)

The feature radar chart is bidirectional. On one hand, radar chart reflects personal situation and preferences; on the other, radar chart shows the requirements of job on students' ability. To illustrate this, here are some examples. According to our survey, Student A is in senior two, has enough pocket money every week, he is good at writing and painting, has the experience of writing competition. The personality of Student A is more perceptual and introverted. He is not interested in research and technical work. When looking for summer job, Student A hopes to work about 30 hours a week and work nearby, he doesn't want to do much physical activities, with an hourly salary of 7 dollars. Use feature radar charts to show personal situation and preference of Student A as below:



Figure 2: Feature Radar Charts of Student A

For the feature radar charts of the work, we take restaurant waiter as an example. Waiters do not require students to master specific skills, and do not require students' analytical ability. Waiters are more demanding on our communication skills. Most of the time, the work of waiters needs us to stand and do physical activities. The working hour of waiters is longer, and the hourly salary is relatively low. Use radar charts to show features of waiters as below:



Figure 3: Feature Radar Charts of Waiters

In short, the feature radar charts of students represent what we have, and the feature radar charts of summer jobs represent what they need. When the "supply" and "demand" balance is reached, the most suitable job is found.

## 5.2 Measurement Based on Graph Distance

The core idea of our model is to compute the graph distance between feature radar charts of student and that of jobs. For most of the same features in two graphs, we use the difference of the numerical level to calculate the graph distance, and then get a comprehensive index by weighted sum method. Because the types of features vary, there are differences in calculating the graph distance of each feature. In this section, we will discuss the calculation method of graph distance and discuss the meaning of each feature in the radar chart in detail. We will give a measurement model to describe how well personal preferences fit into job requirements.

For most of the features in radar charts, we call them "working one side matching" class. Specifically, when personal situation and preference meet the requirements of job features, we define the graph distance of these features as 0 and calculate their graph distances only when they do not meet the job requirements. The formula is as follows:

$$d_{job}^{(feature)} = \begin{cases} 0 & , X_{student}^{(feature)} \ge X_{job}^{(feature)} \\ X_{job}^{(feature)} - X_{student}^{(feature)} & , X_{student}^{(feature)} < X_{job}^{(feature)} \end{cases}$$
(6)

All features in Capability and several items in Characteristics & Requirements like Work Hour, Empirical, these features belong to "working one side matching" class. For high school students, the higher the numerical level of these features, the better they are, which means that they are very outstanding in the ability of work requirements, they have mastered specific skills, strong learning ability and strong adaptability.

Features like Salary, we call them "personal one side matching" class. In contrast to the "working one side matching" class, when the job feature meets personal preferences and needs, we define the graph distance of these features as 0 and calculate their graph distances only when job features do not meet the personal preference. The formula is as follows:

$$d_{job}^{(feature)} = \begin{cases} 0 & , X_{student}^{(feature)} \leq X_{job}^{(feature)} \\ X_{student}^{(feature)} - X_{job}^{(feature)} & , X_{student}^{(feature)} > X_{job}^{(feature)} \end{cases}$$
(7)

After calculating the graph distance of 17 features in all three feature radar charts, we set a weight vector  $W = \{w_{(feature)}\}$  and sum the 17 graph distances in a weighted way to get a comprehensive evaluation index M:

$$M_{job} = \sum_{feature} w_{(feature)} d_{job}^{(feature)}$$
(8)

The weight vector W reflects the importance we attach to different features. When the same student faces different jobs, we can use our model to calculate the comprehensive score  $M_{job}$  of each job. According to the definition of graph distance, the lower the value of  $M_{job}$ , the better the match between personal characteristics and job requirements.

We take the feature radar chart's data of Student A and Waiters in Section 5.1 as an example to calculate the graph distance of each feature in Characteristic & Requirement.

Feature	$X_{student}^{(feature)}$	$X_{job}^{(feature)}$	Graph Distance	Which formula to use
Extraversion	1	3	2	(1)
Introversion	4	1	0	(1)
Empirical	4	2	0	(1)
Work Hour	3	4	1	(1)
PA or Sedentary	2	4	2	(1)
Salary	3	1	2	(2)

Table 6: Examples of Calculating Graph Distance

## 6. Test Model with Fictional Persons

## 6.1 Urban Occupation Distribution Map

Considering that distribution of jobs may vary in different kinds of city and that this difference probably matters to students' summer job options, we decide to design an urban occupation distribution map (hereinafter referred to as UODM) with each city's basic information. First, we investigate into cities of different levels in China and evaluate the most representative characteristics and jobs in it. Then we choose a few typical cities of each level and form the UODM based on these cities' data.

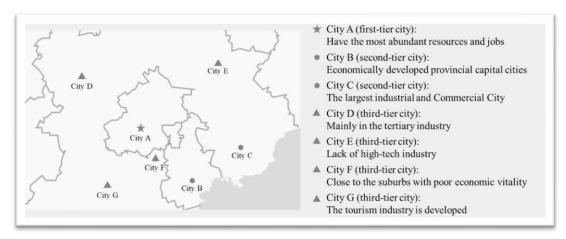


Figure 4: Urban Occupation Distribution Map

Also, we list out the jobs in each city according to its' economic development and industry orientation in order to provide help for our model's testing.

City	Tier	Job List							
		☑Waiter	☑Cashier	☑Lifeguarding	☑Librarian	☑Salesman			
		☑Hamal	☑Cleaner	☑Programmer	☑Researcher	<b>☑</b> Courier			
٨	First	☑Illustrator	☑Craftsmen		☑Translator	☑Reporter			
A	FIISt	☑Editor		☑Postproduction	☑Consulting	☑Planner			
		☑YouTuber	V	Online Tutoring	☑Offline 7	Tutoring			
		☑Data Analys	st 🔽	Instrument Teaching	✓Subtitle '	Translation			
		☑Waiter	☑Cashier	☑Lifeguarding	☑Librarian	☑Salesman			
	Second	☑Hamal	☑Cleaner	□Programmer	□Researcher				
В		☑Illustrator	☑Craftsmen	☑Photographer	☑Translator	☑Reporter			
В	Second	☑Editor		☑Postproduction	□Consulting	□Planner			
		☑YouTuber	V	Online Tutoring	☑Offline 7				
		☑Data Analys	st 🔽	Instrument Teaching	✓Subtitle '	Translation			
		☑Waiter	☑Cashier	☑Lifeguarding	☑Librarian	☑Salesman			
		☑Hamal	☑Cleaner	☑Programmer	□Researcher				
C	Second	☑Illustrator	□Craftsmen	☑Photographer	$\Box$ Translator	□Reporter			
C		☑Editor		☑Postproduction	☑Consulting	□Planner			
		☑YouTuber	V	Online Tutoring	☑Offline 7	Tutoring			
		□Data Analys	st 🗆	Instrument Teaching		Translation			

Table 7: Job List of Each City in UODM

		☑Waiter	☑Cashier	☑Lifeguarding	□Librarian	☑Salesman
	Third	☑Hamal	☑Cleaner	□Programmer	□Researcher	<b>☑</b> Courier
D		☑Illustrator	□Craftsmen	☑Photographer	$\Box$ Translator	☑Reporter
D	Tilliu	☑Editor		☑Postproduction	$\Box$ Consulting	□Planner
		☑YouTuber	$\checkmark$	Online Tutoring		Γutoring
		□Data Analy	st 🗆	Instrument Teaching	✓Subtitle	Translation
		☑Waiter	☑Cashier	□Lifeguarding	☑Librarian	☑Salesman
		☑Hamal	☑Cleaner	□Programmer	□Researcher	☑Courier
Е	Third	☑Illustrator	□Craftsmen	□Photographer	$\Box$ Translator	☑Reporter
E	Tilliu	□Editor	□Accounting	☑Postproduction		☑Planner
		☑YouTuber	$\checkmark$	Online Tutoring	□Offline □	Γutoring
		□Data Analy	st 🗹	Instrument Teaching	✓Subtitle	Translation
		☑Waiter	☑Cashier	☑Lifeguarding	☑Librarian	☑Salesman
	Third	☑Hamal	☑Cleaner	□Programmer	□Researcher	☑Courier
F		☑Illustrator	☑Craftsmen		☑Translator	☑Reporter
Г		☑Editor		☑Postproduction	□Consulting	□Planner
		☑YouTuber	$\checkmark$	Online Tutoring		Γutoring
		□Data Analy		Instrument Teaching	✓Subtitle	Translation
		☑Waiter	☑Cashier	□Lifeguarding	□Librarian	☑Salesman
		☑Hamal	☑Cleaner	□Programmer	□Researcher	☑Courier
G	Third	☑Illustrator	□Craftsmen	□Photographer	$\Box$ Translator	□Reporter
U	Tilliu	☑Editor	□Accounting	☑Postproduction	□Consulting	☑Planner
		✓YouTuber	$\checkmark$	Online Tutoring		Γutoring
		□Data Analy	st 🗹	Instrument Teaching	✓Subtitle	Translation

# **6.2 Fictional Person Constructed According to Our Survey**

Based on the real data obtained from the survey, we selected some representative high school students to help construct our fictional persons. These fictional persons are assigned to different cities in our UODM. They master different specific skills, have various personality and characteristics, and have diverse preferences for summer job options. We use letters A to J as the numbers of 10 fictional persons. Their details are as shown below:

Table 8: The Situation and Preference of Ten Fictional Persons

Person	Description
Student A	Student A lives in City F and is in senior two. He has less pocket money per week. He is outgoing and rational. Student A likes exercising rather than being sedentary. He has many years of swimming experience and obtained the relevant certificate. When looking for a summer job, Student A can accept heavy physical labor and work in a distant place. He expects to work 30 hours a week and his expected hourly salary is \$5.
Student B	Student B lives in City A and is in senior three. He has enough pocket money every week. He is rational and introverted. Student B likes mathematics and computer, has mastered the basic programming ability and has the related competition experience. When looking for a summer job, Student B can accept a certain amount of physical labor and hopes to work in his city. He expects to work 40 hours a week and to be paid \$10 an hour.

(Continued)	
	Student C lives in City B and is in senior two. She has abundant pocket money per week. She is a little introverted and emotional. Student C is good at writing
Student C	and painting and has relevant competition experience. When looking for a summer job, Student C prefers to work nearby and work 30 hours a week. She is reluctant to do many physical activities. Her expected hourly salary is \$8.
	Student D lives in City B and is in senior one. He has enough pocket money
Cturdout D	per week. He is outgoing, emotional and expressive. Student D masters the
Student D	piano and guitar skills and has obtained the certificates of piano. When looking for a summer job, Student D is willing to work far away and accept heavy
	physical labor. He hopes to work 20 hours a week and to be paid \$8 an hour.
	Student E lives in City A and is in senior two. She has enough pocket money
	per week. She is rational and neutral in character. Student E is good at biology
Student E	and chemistry, but she has no experience in doing experiments and research.
	When looking for a summer job, Student E can accept moderate physical labor
	and wants to work in her city. She prefers to work 40 hours a week and expects to be paid \$7 an hour.
	Student F lives in City C and is in senior three. He has less pocket money per
	week. He is emotional and neutral in character. Student F knows photography,
Student F	postproduction and has his own artwork. When looking for a summer job,
	Student F can accept moderate physical labor and work far away. He prefers
	to work 50 hours a week and expects to be paid \$6 an hour.
	Student G lives in City D and is in senior one. She has less pocket money per
	week. She is rational and outgoing. Student G has no unique skills, but she is
Student G	good at communicating. When looking for a summer job, Student G accepts
	moderate physical labor and wants to work nearby. She prefers to work 50
	hours a week and her expected hourly salary is \$4.
	Student H lives in City E and is in senior two. He has enough pocket money per week. He is rational and outgoing. Student H is good at mathematics and
Student H	physics. When looking for a summer job, Student E wants to do fewer physical
Student II	activities and he wants to work nearby. He prefers to work 20 hours a week
	and expects to be paid \$6 an hour.
	Student I lives in City F and is in senior three. He has less pocket money per
	week. He is rational and introverted. Student I likes exercise but has no unique
Student I	skills. When looking for a summer job, Student I can accept heavy physical
	labor and wants to work in his city. He prefers to work 50 hours a week and
	expects to be paid \$4 an hour.
	Student J lives in City G and is in senior one. She has abundant pocket money
Ctradent I	per week. She is emotional and neutral in character. Student J has mastered a
Student J	second foreign language. When looking for a summer job, Student J can accept
	moderate physical labor and can work far away. She prefers to work 30 hours a week and expects to be paid \$6 an hour.
	a week and expects to be paid by an noun.

To make the characteristics of each person described in the table above become numerical features fed to the model. We quantify the above complex details into 17 features in the features radar charts, as shown in the table below:

Table 9: Numerical Level of Features of Each Fictional Person

Numerical				F	ictional	Studen	ts			
Level of		D	-	D.	Г	Г	-	TT	т	т
Features	Α	В	С	D	Е	F	G	H	I	J
$X_{student}^{(grade)}$	2	3	2	1	2	3	1	2	3	1
$X_{student}^{(allowance)}$	1	2	3	2	2	1	1	2	1	3
$X_{student}^{(rational)}$	3	3	1	1	3	1	3	3	3	1
$X_{student}^{(emotional)}$	1	1	3	4	1	3	1	1	1	3
$X_{student}^{(distance)}$	3	2	1	3	2	3	1	1	2	3
$X_{student}^{(skill)}$	4	3	3	4	4	3	1	4	1	3
$X_{student}^{(research)}$	1	1	1	1	3	1	1	1	1	1
$X_{student}^{(art)}$	1	1	1	2	1	3	1	1	1	1
$X_{student}^{(social)}$	1	1	1	3	1	1	4	2	1	3
$X_{student}^{(management)}$	1	1	1	1	1	1	1	1	1	1
$X_{student}^{(conventional)}$	3	1	1	2	1	2	3	2	2	2
$X_{student}^{(extraversion)}$	4	1	2	4	1	1	3	3	1	1
$X_{student}^{(introversion)}$	1	3	1	1	1	1	1	1	3	1
$X_{student}^{(empirical)}$	4	3	3	3	1	3	1	1	1	1
$X_{student}^{(work\ hour)}$	3	4	3	2	4	5	5	2	5	3
$X_{student}^{(PA/sedentary)}$	5	3	2	5	3	3	3	2	5	3
$X_{student}^{(salary)}$	2	5	4	4	4	3	2	3	2	3

## 6.3 Model Test and Results Analysis

We determine the numerical level of features of each job through investigation. There data, along with each fictional person's features, will be put into the model. For each fictional person, based on the graph distance model, we can get the score of each work. By sorting the scores from small to large, the recommended order of "The best summer Job" is obtained. In the table below, we list each person's top 5 recommended jobs and analyze the correspondence between the recommended results and the fictional person's situation and preference.

Table 10: Recommended Jobs of Each Person and Results Analysis

Student   Recommended Jobs   Results Analysis			, T
Courier A Cashier lives in the city F, where there is a lifeguard occupation, Waiter so the most recommended job of the model is Lifeguard.  Hamal The algorithm also recommends some traditional jobs.  Data Analyst Student B is good at computer and mathematics and has certain programming ability. The model recommends Cashier to the programmer's high requirement for ability, the Cleaner algorithm does not recommend the Programmer.  Editor Student C is good at writing and painting and she expects a higher salary. The model recommends Editor according to her ability. Introverted personality makes the model Waiter think Cashier, Librarian suits her situation. The algorithm Reporter also recommends several traditional jobs.  Instrument Teaching Waiter outgoing and expressive. With his proficiency in musical instruments, the model thinks Instrument Teaching is the most suitable summer job for him. His other features indicate that he can also do work like Waiter, Salesman.  Cashier Student E has excellent abilities in some subjects, so the Researcher model believes that she can do a job like Researcher or Tutoring. However, perhaps because of her lack of research experience, thus the algorithm did not rank Researcher first.  Waiter Student Fs unique ability and experience in photography and postproduction made the algorithm recommend Photographer and Postproduction. City C happens to have these two occupations. His other features indicate that he can also do work like Waiter, Cashier.  Waiter Student G has no unique skills, but She is good at communicating. The first five jobs recommended by the model are traditional jobs that do not require specific skills. Due to her good social skills, the algorithm ranks Courier Waiter and Salesman in front.  Online Tutoring Student his outgoing and good at mathematics and physics. According to his situation and preference, the model ranked Online Tutoring and Offline Tutoring in	Student		Results Analysis
A Cashier Waiter so the most recommended job of the model is Lifeguard. Hamal The algorithm also recommends some traditional jobs.  Data Analyst Courier certain programming ability. The model recommends B Librarian Data Analyst according to his preference. However, due to the programmer's high requirement for ability, the algorithm does not recommend be Programmer.  Editor Student C is good at writing and painting and she expects a higher salary. The model recommends Editor according to her ability. Introverted personality makes the model think Cashier also recommends several traditional jobs.  Instrument Teaching Waiter also recommends several traditional jobs.  Instrument Teaching Waiter outgoing and expressive. With his proficiency in musical instruments, the model thinks Instrument Teaching is the most suitable summer job for him. His other features indicate that he can also do work like Waiter, Salesman.  Cashier Student E has excellent abilities in some subjects, so the model believes that she can do a job like Researcher or Tutoring. However, perhaps because of her lack of research experience, thus the algorithm did not rank Researcher first.  Waiter Student F's unique ability and experience in photography and postproduction made the algorithm recommend Photographer and Postproduction. City C happens to have these two occupations. His other features indicate that he can also do work like Waiter, Cashier.  Waiter Student G has no unique skills, but She is good at communicating. The first five jobs recommended by the model are traditional jobs that do not require specific skills. Due to her good social skills, the algorithm ranks Cashier waiter and Salesman in front.  Online Tutoring Student his outgoing and good at mathematics and physics. According to his situation and preference, the model ranked Online Tutoring and Offline Tutoring in			Student A is proficient in swimming. He can accept a lot
Waiter   So the most recommended job of the model is Lifeguard.		Courier	of physical labor and the salary requirements are low. He
Hamal The algorithm also recommends some traditional jobs.  Data Analyst Student B is good at computer and mathematics and has certain programming ability. The model recommends Librarian Data Analyst according to his preference. However, due to the programmer's high requirement for ability, the Cleaner algorithm does not recommend the Programmer.  Editor Student C is good at writing and painting and she expects a higher salary. The model recommends Editor according to her ability. Introverted personality makes the model Waiter think Cashier, Librarian suits her situation. The algorithm also recommends several traditional jobs.  Instrument Teaching Student D master piano and guitar, meanwhile, he is outgoing and expressive. With his proficiency in musical instruments, the model thinks Instrument Teaching is the Salesman most suitable summer job for him. His other features indicate that he can also do work like Waiter, Salesman.  Cashier Student E has excellent abilities in some subjects, so the Researcher model believes that she can do a job like Researcher or Tutoring. However, perhaps because of her lack of Librarian research experience, thus the algorithm did not rank Researcher first.  Waiter Student F's unique ability and experience in photography Cashier and postproduction made the algorithm recommend Photographer Photographer and Postproduction. City C happens to Cleaner have these two occupations. His other features indicate that he can also do work like Waiter, Cashier.  Waiter Student G has no unique skills, but She is good at communicating. The first five jobs recommended by the model are traditional jobs that do not require specific skills. Due to her good social skills, the algorithm ranks Courier Waiter and Salesman in front.  Online Tutoring Student h is outgoing and good at mathematics and physics. According to his situation and preference, the model ranked Online Tutoring and Offline Tutoring in	A	Cashier	lives in the city F, where there is a lifeguard occupation,
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Courier   Certain programming ability. The model recommends		Hamal	The algorithm also recommends some traditional jobs.
B Librarian Data Analyst according to his preference. However, due to the programmer's high requirement for ability, the algorithm does not recommend the Programmer.  Editor Student C is good at writing and painting and she expects a higher salary. The model recommends Editor according to her ability. Introverted personality makes the model think Cashier, Librarian suits her situation. The algorithm also recommends several traditional jobs.  Instrument Teaching Student D master piano and guitar, meanwhile, he is outgoing and expressive. With his proficiency in musical instruments, the model thinks Instrument Teaching is the Maiter Salesman most suitable summer job for him. His other features indicate that he can also do work like Waiter, Salesman.  Cashier Student E has excellent abilities in some subjects, so the Researcher model believes that she can do a job like Researcher or Tutoring. However, perhaps because of her lack of Librarian research experience, thus the algorithm did not rank Online Tutoring Researcher first.  Waiter Student F's unique ability and experience in photography and postproduction made the algorithm recommend Photographer and Postproduction. City C happens to have these two occupations. His other features indicate that he can also do work like Waiter, Cashier.  Waiter Student G has no unique skills, but She is good at cashier communicating. The first five jobs recommended by the model are traditional jobs that do not require specific Salesman model are traditional jobs that do not require specific Scalesier Waiter and Salesman in front.  Online Tutoring Student h is outgoing and good at mathematics and physics. According to his situation and preference, the model ranked Online Tutoring and Offline Tutoring in		Data Analyst	Student B is good at computer and mathematics and has
Cashier Cleaner  Editor Student C is good at writing and painting and she expects a higher salary. The model recommends Editor according to her ability. Introverted personality makes the model think Cashier, Librarian suits her situation. The algorithm Reporter  Instrument Teaching Waiter  D Cashier  Courier  Courier  E Courier  Tutoring. However, perhaps because of her lack of research experience, thus the algorithm did not rank Researcher photographer  Cashier  Student F's unique ability and experience in photography and postproduction that he can also do work like Waiter, Cashier.  Waiter  Student F's unique ability and experience in photography and postproduction. City C happens to have these two occupations. His other features communicating. The first five jobs recommended by the model are traditional jobs that do not require specific Student F has no unique skills, but She is good at Cashier  Waiter  Student G has no unique skills, the algorithm ranks Courier  Waiter Student G has no unique skills, the algorithm ranks Courier  Waiter Student G has no unique skills, the algorithm ranks Courier  Waiter Student G has no unique skills, the algorithm ranks Courier  Waiter Student G has no unique skills, the algorithm ranks Courier  Waiter Algorithm of the physics. According to his situation and preference, the model ranked Online Tutoring and Offline Tutoring in		Courier	certain programming ability. The model recommends
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Reporter   also recommends several traditional jobs.	C	Librarian	1 -
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Waiter Cashier Photographer Postproduction Balesman Cashier Cleaner Cashier  Waiter Cashier Postproduction Cleaner Cashier  Waiter Cashier  Cashier  Student F's unique ability and experience in photography and postproduction made the algorithm recommend Photographer and Postproduction. City C happens to have these two occupations. His other features indicate that he can also do work like Waiter, Cashier.  Waiter Student G has no unique skills, but She is good at communicating. The first five jobs recommended by the model are traditional jobs that do not require specific skills. Due to her good social skills, the algorithm ranks Courier Waiter and Salesman in front.  Online Tutoring Cashier Photographer And Postproduction City C happens to have these two occupations. His other features indicate that he can also do work like Waiter, Cashier Cashier Student G has no unique skills, but She is good at communicating. The first five jobs recommended by the model are traditional jobs that do not require specific skills. Due to her good social skills, the algorithm ranks Courier Waiter and Salesman in front.  Cashier Donline Tutoring According to his situation and preference, the model ranked Online Tutoring and Offline Tutoring in		Librarian	1
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H Courier Waiter and Salesman in front.  Online Tutoring Student h is outgoing and good at mathematics and physics. According to his situation and preference, the model ranked Online Tutoring and Offline Tutoring in		Cleaner	1
H Cashier physics. According to his situation and preference, the model ranked Online Tutoring and Offline Tutoring in		Courier	
H Cashier physics. According to his situation and preference, the model ranked Online Tutoring and Offline Tutoring in		Online Tutoring	Student h is outgoing and good at mathematics and
Waiter model ranked Online Tutoring and Offline Tutoring in	**	•	1
	Н		1
			1

#### (Continued)

Н	Offline Tutoring	the algorithm thinks Online Tutoring is more suitable.					
	Courier	Student I and Student G are similar in that they do not					
	Cashier	master a specific skill, but Student I can accept a lot of					
I	Librarian	physical labor. Therefore, the model recommends some					
	Hamal	traditional jobs like Courier, Hamel, Cleaner which do					
	Cleaner	not need to master specific skills.					
	Cashier	Student J has mastered the second foreign language.					
	Courier	Besides the traditional manual jobs, the model thinks she					
J	Subtitle Translation	can do translation work like Subtitle Translation.					
	Waiter	However, because there is no Translator in the job list of					
	Librarian	her city, the algorithm does not recommend it in top 5.					

From the model results and analysis in the table above, we can see that: The algorithm mainly recommends jobs such as Waiter, Courier, Cashier, Cleaner that do not need to master specific skills or need to have relevant work experience. For those who have mastered special skills (such as computer, musical instruments, photography) and have relevant preferences, the algorithm will rank the corresponding occupation in front according to the personal situation. Generally speaking, our model can make correct recommendations according to the situation and preference of high school students.

# 7. Apply the Model to the Webpage

In this section, we apply our algorithm to webpages, these webpages contain the filling of personal information, the presentation of recommended summer job options and some useful information. The layout of the webpage is simple and easy to understand. When high school students use it to test the most suitable summer job for themselves, they only need to fill in the information and submit it step by step according to the prompts of the webpages. Our webpages contain the following six sections:

- (1) Welcome Page: We use this page to introduce our project and guide users to start the test.
- (2) Basic Information Page: This page is used to collect basic information of users and evaluate their own personal situation.
- (3) Survey Page: This page contains a simple survey, and the model will assess users' personal preferences and abilities based on their answers.
- (4) Results Page: This page presents the summer jobs recommended by our algorithm.
- (5) Guide Page: This page provides useful information about the recommended job. For example, skills to master, links to knowledge, nearest work location, working hours per week or per day, salary to be paid.
- (6) Principle Introduction Page: This page briefly introduces the core idea of our model and explains the principle of the algorithm in simple language.

The design of our Webpages is as follows:



# **Test Which Summer Job** Is Most Suitable For You!

Hold on! Just fill in your basic information and answer some simple questions, then we can provide you with several summer job options that are most suitable for you! In the meantime, we'll tell you how to prepare for it! Click the LET'S BEGIN! below to start the test and click WHAT'S THE PRINCIPLE? to know details about our algorithm.



## **BASIC INFORMATION**

Don't worry! The information you fill in is for testing only. We will not collect them! This information can help us assess your personal situation.

- 1. What grade are you in?
- Senior One Senior Two Senior Three
- 2. How much is your weekly allowance?
- \$0~\$10
- \$10~\$15\$15~\$20

3. How far is your residence from a commercial area?

- O More than \$20
- Nearby ○ A little far ○ Faraway

4. Which city do you live in?

**NEXT STEP!** 



# **A SIMPLE SURVEY**

To answer some questions below we will assess your capabilities and preferences through this survey. Don't worry! Your information won't leak!

- 1. How many days a week do you expect to work
- 1~2 days
- 3~4 days
- O 5 days
- O More than 6 days
- 2. What is your expected hourly salary?
- Less than \$4 \$4 ~ \$7
- \$7~\$10
- O More than \$10
- 3. How long do you expect to work every day?
- 4. How far can you accept working distance

- ······(More survey questions can be found in the attachment)

Congratulations! You have completed the filling! Click the SUBMIT! button below to view your results!

SUBMIT!

## **YOUR BEST OPTION!**



According to your personal situation, preferences, and ability to compare with the work needs, the summer jobs below may be your best choice!



For the most recommended jobs, we have collected some useful information for you so that you can be prepared! Click the GIVE MEA GUIDE! button below to see the details.

**GIVE ME A GUIDE!** 

## WHAT YOU NEED TO KNOW



This contains detailed information about the recommendation, the abilities you need to master and the precautions  ${\sf GOOD\ LUCK!}$ 

#### 1. Capability & Requirement

To be a **LIFEGUARDING**, you must make sure you are proficient in swimming and have certificates. Lifeguard work has a certain risk and need a strong sense of responsibility. The links below contain knowledge about **LIFEGUARDING**:

https://americanlifeguard.com/

https://www.redcross.org/take-a-class/lifeguarding

#### 2. Job Recommendation

The nearest swimming pool offers LIFEGUARDING work.
The workplace is about 3 kilometers away from your home.
You need to work four days a week, four hours a day (13:00 – 17:00)

#### 3. Salary

If you stick to summer job for two months, we estimate that you will get: \$528



# **OUR ALGORITHM**

We assess your personal situation and preferences through some questions and quantify these information into different feature indicators. At the same time,, we get the requirements of each job for these indicators after investigation. The algorithm compares the quantified personal indicators with the work indicators, scores each job and gets the recommended ranking of them, to find the most matching one.

Don't worry! All information in the evaluation process is confidential!

## 8. Generalization

In the model above, we evaluate each job's requirements of students from 17 factors which can be divided into three aspects: Situation, Capability, Characteristic & Requirement. In fact, for those new jobs that are not mentioned in our model, we only need to give their corresponding values of the 17 factors, then we can add new jobs to the model to perfect our recommendations of summer job options.

Before the model's recommendation, we also need values of the 17 factors for the high school students, which give a description of their personal situation and preference. As a result, we can give the corresponding values of the factors based on personal information.

We collect the values of the 17 factors of an actual person based on Likert Scale of Five and match the collected values to the model's factor. For subjective factors related to personality, we can use results of some personality tests like MBTI Occupational Personality Test, which means that we can use several questions to represent one specific personality from different perspectives.

Above we explained the scalability of the model and how to add new personal data to our model. Next, we want to discuss how to add new work to the model in detail:

#### (1) Assumptions:

As mentioned before, we only need to give 17 values of corresponding factors, then we can add the job to the model. Suppose that one factor takes its value in  $\Omega = \{1, 2, ..., n\}$ . The job's requirement on specific factor means that the individual's value on this factor should fall into the interval  $\omega$  at least, in which  $\omega$  is a subset of  $\Omega$ .

Firstly, denote the value for the factor (requirement or capability) of some person who is taking part in or temporarily taking part in the job by a random variable  $\varepsilon$ . Then we have:

$$p(\varepsilon = k) = p_k, \qquad k \in \omega, \tag{9}$$

$$\sum_{k \in \omega} p_k = 1,\tag{10}$$

Secondly, we assume that the random variable  $\varepsilon$  obey normal distribution and denote the mean value of  $\varepsilon$  by:

$$E(\varepsilon) = C, \tag{11}$$

#### (2) Model:

We assume that the values of a student who hopes to take the job should reach the mean value *C* in aspects of capability, characteristic and situation, and only in this way will we recommend the job. In other words, in this circumstance, the distance between the student's expectations and the job's requirements calculated by the model will be zero. If distance is not equal to zero, the gap will be evaluated by the distance.

Therefore, if we want to add a new job in the model, we only need to collect its 17 mean values on corresponding factors.

#### (3) Complements:

For the special factor Salary, its mean value reflects how much money the job can offer. Therefore, if the working market is balanced, the salary of all the staff should fluctuate around the balance point, which means that it's reasonable to use the mean value of the salary to represent the salary job can give.

Similarly, in the discussion of other factors, we also give the market balancing assumption: the staff's capability, characteristic and situation should be balanced with salary requirement, otherwise it will cause the flow of staffs which will help the market related to the factor back to its balance point.

#### (4) Carry it out:

Based on the method of how to add new fictional person's data to the model, we conduct a survey on people who is taking or temporarily have participated in some job about their ability and personal characteristics. When we gather enough data from survey, we can use statistical method to calculate each factor's mean value.

#### 9. Reference

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- [3] Domelen, Dane R Van . "Part-Time Work and Physical Activity in American High School Students." Journal of Occupational & Environmental Medicine 57.8(2015):904-9.
- [4] Stephen B. Lawton. "Part-Time Work and the High School Student: Costs, Benefits and Future. A Review of the Literature and Research Needs." Academic Achievement (1994):30.
- [5] "Part-Time Work of High School Students: Impact on Employability, Employment Outcomes and Career Development." Australian Journal of Career Development (2013).

#### 10. Attachment

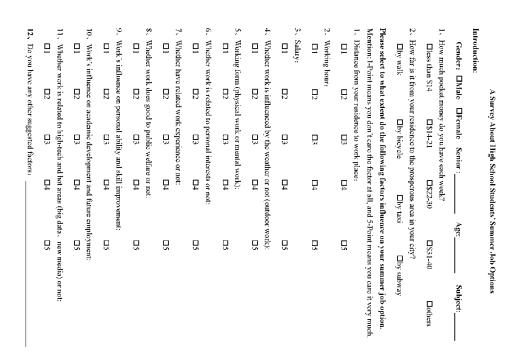
## **Attachment 1: Code of our algorithm**

```
1. import pandas as pd
2. import numpy as np
3.
4.
5. # Distance Function
6. def skill_distance(skill_personal,skill_work,weight=1):# Graph Distance
   produced by Capability
7.
       if int(skill personal) >= skill work:# Meet the requirements
8.
           return 0
9.
       else:
10.
           return weight*abs(int(skill_personal) - skill_work)
11.
12.
13.def Distance_distance(distance_para, weight=1):# Graph Distance produced
   by distance
14.
       return 0
15.
16.
17.def normal_distance(work,personal,normal=True,weight=1):# Graph Distance
    produced by others
       if normal==True:
18.
19.
           if work > personal: # Do not meet the requirements
20.
               return abs(weight)*abs(work-personal)
21.
           else:
22.
                return 0
       elif normal==False:
23.
24.
           if work < personal: # Beyond the Limits of work
25.
               return abs(weight)*abs(work-personal)
26.
           else:
27.
                return 0
28.
29.
30.# Sorting and Reporting
31.def sort_order(num,reverse=True): # Sort the score
32.
       num sort=sorted(num,reverse=reverse)
33.
       order=[0]*len(num)
34.
       before=num_sort[0]
35.
36.
       for i in range(len(num_sort)):
37.
           for j in range(len(num)):
38.
               if i>0 and num_sort[i] == before:
39.
                    continue
40.
                if num[j] == num sort[i]:
41.
                    order[j]=k
42.
                    k=k+1
43.
           before=num sort[i]
44.
       order r=[0]*len(num)
```

```
45.
       for i in range(len(num)):
46.
           for j in range(len(num)):
47.
               if i+1==order[j]:
48.
                    order_r[i]=j+1
49.
50.
       return order, order r
51.
52.
53.def report(num, distance_all, works_name, skill, works, n=3, reverse=False):#
   Rank and recommend jobs
54.
       distance=distance all[num]
55.
       skill=skill.iloc[num]
56.
       print("Recommended Jobs Order:\n\t%-
   20s"%str("work name")+'\tdistance'+'\tskill level(person/work)')
57.
     order,order_r=sort_order(num=distance,reverse=reverse)
58.
       if n>len(works name):
59.
           n=len(works name)
60.
       for i in range(n):
           print('%d:'%(i+1)+'\t%-20s'%works_name[order_r[i]-1]+'\t%-
61.
   10.2f'%distance[order r[i]-1],end='')
62.
           print('\t%d'%int(skill[works_name[order_r[i]-
   1]])+'/%d'%int(works[works name[order r[i]-1]][5]))
63.
64.
65.# Read Parameters
66.works=pd.read_csv(r'para_work.csv',header=0) # Read jobs' requirements
   parameters
67.works_name=works.columns[2:] # Job List
68.features=works.iloc[:,0] # Features, factors
69.work weight=works.iloc[:,1]
                                  # Weights vector
70.para=pd.read_csv(r'para_personal.csv')
                                            # Read persons' parameters
71. person_name = \{(i-65): chr(i) \text{ for } i \text{ in } range(65, 65+10)\} # Persons' name
72. name list = [chr(i) for i in range(65, 65+10)]
73.skill=pd.read csv(r'skill personal.csv',header=0) # Read fictional perso
   ns' parameters
74.distance weight=1
                                           # Weights of distance
75.skill para=skill[0::2]
                                           # Personal information
76.skill_weight=skill[1::2].iloc[:,1:]*5 # Work weight of different persons
77.skill para.index=range(10)
78.skill weight.index=range(10)
79.
80.
81.# Calculate All Distances
82.distance all=[[]]*len(person name) # Calculate the distance of the perso
   n to all work
83.
84. for m in range(len(person name)):
85.
       para person=para[person name[m]]
86.
       distance_person=[0]*len(works_name)
87.
       k=0
88.
      for i in works name:
```

```
89.
            total=0
90.
            for j in range(len(features)):
91.
                if features[j]=='Distance':
                    distance=Distance_distance(distance_para=para_person[j],
92.
   weight=skill_weight[i][j])
                elif features[j]=='Skill Type':
93.
                    distance=skill distance(skill personal=skill para[i][m],
94.
   skill_work=works[i][j],weight=skill_weight[i][j])
95.
                elif work_weight[j]>0:
96.
                    distance=normal_distance(works[i][j],para_person[j],norm
   al=True, weight=work_weight[j])
97.
                elif work weight[j]<0:
98.
                    distance=normal_distance(works[i][j],para_person[j],norm
   al=False, weight=work_weight[j])
99.
                total=total+distance
100.
                  distance person[k]=total
101.
102.
              distance all[m]=distance person
103.
104.
105.
          # Report Recommendation
106.
          num=0 # Set test number
          report(num, distance_all, works_name, skill_para, works, n=303)
107.
```

# **Attachment 2: Survey**



□Yes, to be specifie □No	Do you have any subject that you master well?	If you are not interested, then you don't need to answer the following 2 questions:	O1 O2 O3 O4 OS	2. Education Industry (online & offline tutor, etc.):		□()thers	□Salesmen □Flyer-sender □Hamal □Cleaner □Courier □贮膜	□Waiter □Barkeeper □Cashier □Public security □Librarian □Dormitory	Select summer jobs that you probably will choose (multiple choice):	□ Y\$\$ □ No	Have you ever engaged in jobs or part-time jobs in this industry?	O1 O2 O3 O4 O5	To what extent can you accept the main tasks of this industry?	01 02 03 04 05	·I fow do you think about your interpersonal communication ability?	If you are not interested, then you don't need to answer the following 4 questions:	01 02 03 04 05	1. Service Industry (restaurant waiter, eashior, barkcoper and etc.)	Mention: 1-Point represents the lowest level, and 5-Point represents the highest level.	Do you have interests in following industries?		4. The test nourly rate that you can accept is:  [] [] [] [] [] [] [] [] [] [] [] [] [] [		3. The number of working days every week that you can accept is:	□less than 2 hours □haif-day (4 hours) □whole day (8 hours) □more than 8 hours	2. The daily working hour you can accept is:	□ 10 min □ 30 min □ 60 min □ more than 60 min	1. The most commuting time (one way) that you can accept is:
□Photograph assistant □Post-production □IIIustrator	Select summer jobs that you probably will choose (multiple choice):	□Yes □No	·Have you ever publish/sale/issue any related work?	□Yæ □No	Do you have any related competition experience?	□Yes, to be specific □No	:Do you master any specific skills? (music instrument, photography, PR. PS. handcraft, etc.)	If you are not interested, then you don't need to answer the following $3$ questions:	01 02 03 04 05	4. Design & Art(musician, photographer, design, handeraft, art, etc.):		□Others:	□lixperiment Researcher □Programmer □Data Analysist	Select summer jobs that you probably will choose (multiple choice):	□Yæ □No	Do you have any related competition or research experience?	☐Yes, to be specific ☐No	·Do you master any related skills? (programming, experiment designing, etc.)		·How do you think about your logic ability?	If you are not interested, then you don't need to answer the following 3 questions:	01 02 03 04 05	3. Technical Industry (researcher, IT, etc.):		er:	Tition — Assistant	·Select summer jobs that you probably will choose (multiple choice):	

□UI design	□Inst	☐Instrument tutor	□Craftsman	□Others:	15:
5. Language & Articles/translator.	Articles(trar	slator, writer,	· reporter etc.):		
]	]	]	]		
	□2	<u></u>	4	8	
If you are not interested, then you don't need to answer the following 3 questions:	terested, the	n you don't n	eed to answer t	he following :	3 questions:
·120 you master any specific skills?(second foreign language、writing, etc.)	ny specific sl	kills?(second I	òreign language	writing, etc	٤
□Yos, to be specific	specifie		□.No		
Do you have any related experience?	related expe	rience?			
□Yos					
·How do you think about your following ability?	ık about your	tollowing abi	lity?		
Expression	<u>-</u>	<u></u>	<u></u>	4	<u>0</u>
Writing	<u> </u>	<u></u>	<u>"</u>	4	<u> </u>
·Select summer jobs that you probably will choose (multiple choice):	obs that you p	probably will o	zhoose (multiple	choice):	
□Subtitle	□Trar	□Translation □	□Reporter	□Editor	□Writing
□Others:					
6. Finance (accountant, consultant, etc.):	ountant, cons	ultant, etc.):			
□	<b>-</b> 2	_3	<b>Q</b>	0	
If you are not interested, then you don't need to answer the following 4 questions:	terested, the	n you don't n	eed to answer t	he following-	4 questions:
'To extent can you accept digits (bills, finance)?	u accept digi	ts (bills, finan	oc)?		
<u>-</u>	<b>-</b> 2	2	4	G	
·How do you think of your logical ability?	ık of your log	çical ability?			
<u></u>	<b>1</b> 2	3	4	G	
·How well do you master office software like Excel?	u master offi	æ software lik	e Excel?		
<u> </u>	<b>1</b> 2	3	<b>4</b>	<u>_5</u>	
·Select summer jobs that you probably will choose (multiple choice):	obs that you	probably will o	zhoose (multiple	choice):	
□Accountant	□Inst	□Insulting & Industry Roscarch	ry Roscarch	□Statistics & Analysis	& Analysis
□Others:					

If you are no	₽	7. Operation
t interested, th	<b>-</b> 2	peration (new media operation & planning, etc.)
en you don't ı	<u>_</u> 3	peration & pla
need to answer	4	nning, etc.):
If you are not interested, then you don't need to answer the following 3	0	
3 questions:		

·How do you think about your team cooperation/communication ability?

·! Iow do you think about your insight & analysis ability?

<u>n</u>

Select summer jobs that you probably will choose (multiple choice):

Upload, YouTuber 

Blog operator 

Planner

Others:

24