# An Analysis of Happiness in the U.S. post-COVID-19\*

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#### Abstract

This study investigates the level of happiness in the U.S. in 2021 and explores potential factors that may influence it. Using data from the 2021 US General Social Survey, we conducted a thorough analysis and found that the overall level of happiness in the U.S. is relatively high, albeit with slight variations under different conditions. Our study also includes an updated version of the survey in the Appendix to further discover our points of interest. By researching the happiness level in the U.S. and its potential determinants, our research contributes to a deeper understanding of the psychological and social well-being of Americans in 2021.

# 1 Introduction

Human beings strive for different things in life, but the ultimate goal is usually to achieve happiness. Happiness can be seen as a measure of life quality, and it is often associated with factors such as income, education, social interactions, and family. The relationship between happiness and age has been widely studied, and research suggests that there is not much change in happiness until around the age of 55, after which happiness starts to increase, peaking around 67, with a quite sharp decline around the age of 75 (Frijters and Beatton 2012). Studies examining the relationship between gender and happiness have found that individuals in the United States were more than twice as likely to experience well-being in states with high gender equality scores compared to states with low gender equality scores (Holter 2014). The relationship between race and happiness has also been studied, with research suggesting that the gap in happiness between whites and blacks is substantial, with whites more likely to report being very happy and less likely to report being not too happy (Icel and Ludwig-Dehm 2019). Several studies conducted in Europe suggest that working fewer hours is correlated with higher life satisfaction (Shao 2022). Regarding income, studies have shown that the relationship between perceived sufficient income and happiness is mediated by perceived health. Individuals with sufficient income are more likely to have better perceived health, which leads to increased happiness (Robert Weech-Maldonado and Miller 2017).

This paper delves into the complex relationship between age, gender, race, working hours, and income, and their impact on an individual's overall happiness. The findings reveal that the level of happiness among various age groups has similar patterns. Additionally, the study suggests that male respondents tend to report higher levels of happiness compared to their female counterparts, whereas the level of happiness remains similar across different racial groups. There is no significant difference in working hours and income level between different levels of happiness.

The remainder of the paper is split into five sections. Section 2 explains the data source and collection methodology, key features, our selected data's characteristics, strengths and weakness, as well as potential ethics issues. Section 3 discusses the methods used to produce the wanted results to investigate the relationship between happiness and the various factors. Section 4 presents the findings from our methodology.

### 2 Data

### 2.1 Data Source and Collection

To get better insights on what factors affect happiness, we utilized the 2021 US General Social Survey ("US General Social Survey" 2021) from NORC. The raw dataset is extracted from the survey and was imported in R (R Core Team

<sup>\*</sup>Code and data are available at: https://github.com/julieenguyennn/An-Analysis-of-Happiness-in-the-America-post-COVID-19

2022) using the package Haven (Wickham, Miller, and Smith 2022). It includes data from 568 survey questions for 4,032 survey participants. All the interested variables were first selected from NORC and then added to an extract, which was later exported in the Excel Workbook format. The R package readxl (Wickham and Bryan 2022) was used to read the Excel Workbook file in R. Using the R package tidyverse (Wickham et al. 2019) and dplyr (Wickham et al. 2022), we were able to clean and perform exploratory data analysis on the dataset to get insights into the data. Further, we used R package ggplot2 (Wickham 2016), Knitr (Xie 2014) and KableExtra (Zhu 2021) to visualize the data for this paper.

The survey of interest in this report is the General Social Survey ("US General Social Survey" 2021), one that monitors pubic opinion and behavior in the United States. It has been conducted since 1972 by the NORC at the University of Chicago and funded by the National Science Foundation(NSF); aiming to minimize all changes via retaining similar sampling and questioning approaches.

# 2.2 Methodology

Since its inception, the GSS has traditionally used in-person data collection as its primary mode of data collection. However, to safeguard the health of staff and respondents during the COVID-19 pandemic, the 2021 GSS data collection used a mail-to-web methodology (supplemented with phone for respondents who needed the option) instead of its traditional in-person interviews.

Outreach was conducted via mail and phone using commercially available phone number matches for addresses in the sample or inbound phone contact. GSS staff redesigned the mail-based outreach to respondents to introduce the GSS to fresh address-based sample and encourage them to participate, either by web or over the phone. Throughout the data collection period, selected households were sent postcards, invitation packets, and reminder letters using a combination of USPS and FedEx and urging them to complete the 2021 GSS survey. The sample was released in three batches, with evaluation of respondent recruitment protocol for each batch allowing the fine-tuning of protocol for subsequent batches.

With a response rate of 17.4%, a total of 4,032 surveys were completed; from December 1, 2020, to May 3, 2021. 88.3% of those respondents completed the survey via the web, and 11.7% completed it via the phone.

### 2.3 Key Features

The GSS collects data on contemporary American society to monitor and explain trends in opinions, attitudes, and behaviors. The GSS contains a standard core of demographic, behavioral, and attitudinal questions, plus topics of special interest. Among the topics covered are civil liberties, crime and violence, intergroup tolerance, morality, national spending priorities, psychological well-being, social mobility, and stress and traumatic events. The survey data has 4,032 respondents and counts 735 variables.

# 2.4 Variable Selection

06 variables were selected to conduct analysis for the report including respondents' age, sex, race, working hours, and income. We first viewed the relationship of happiness towards different age, sex, racial groups to investigate the national trend of happiness in the year 2021. Other variables are used to explore the relationship and their impact on happiness. For our study, alongside the comprehension of happiness nationwide in the year 2021, we wanted to focus on how work-related factors impact the population's happiness.

Happiness was self-measured by the respondents using the survey asking how happy they felt. It is scaled as "not too happy", "pretty happy", "very happy". Any type of responses that fell into "Inapplicable", "No Answer", "Do not Know/Cannot Choose", "Skipped on Web" were coded as "Non Applicable". Age of respondents was recorded each from 18 to 88 years old, and 89 and above. The participant's sex was measured as "male" and "female" with a small percentage (2.2%) of "Not Applicable" and "No answer". For variable regarding race, the survey separated the options for response as "Black", "White", and "Other". Only about 1.33% of the respondents left their answers as "Non Applicable".

Working hours refer to the hours the respondent had worked the week before they responded to the survey. Income of the respondent is also taken into account as we believe that it is an important factor in examining the happiness trend in overall and also act as a potential motive for happiness. Income was divided into 12 levels, respectively lower then \$1000, \$1000 to 2999, \$3000 to 3999, \$4000 to 4999, \$5000 to 5999, \$6000 to 6999, \$7000 to \$7999, \$8000 to 9999,

\$10000 to 14999, \$15000 to 19999, \$20000 to 24999 and more than \$25000. The respondents were asked to respond to which group their previous year's earnings fell into.

### 2.5 Strengths and Weaknesses

One strength of the 2021 GSS is that the use of mail-to-web methodology and phone options allowed for data collection to continue despite the COVID-19 pandemic and potential safety concerns. This approach allowed for a wider range of participants, including those who may have been hesitant or unable to participate in traditional in-person interviews. The use of commercial phone number matches also helped to ensure a representative sample, which is important for drawing accurate conclusions and generalizing findings to the broader population.

Additionally, the fine-tuning of the recruitment protocol after each batch release is another strength of the 2021 GSS. This iterative process helped to improve the effectiveness of the data collection process and increase the likelihood of obtaining responses from a diverse group of individuals. By analyzing the results of each batch, the protocol was adjusted to better reach and engage potential respondents, ultimately resulting in a higher response rate and a more representative sample.

One weakness of the 2021 GSS is the change in how survey questions were administered, which could have impacted the answers. Due to the COVID-19 pandemic, the survey needed to primarily administer questions over the web without an interviewer's assistance, resulting in some changes in how the questions were measured. For instance, the inclusion of "Don't Know" response categories was only for factual questions and not opinion questions, unlike in previous years where interviewers could record Don't Knows regardless of question type. Such changes could have introduced bias in the responses and affected the comparability of results across different years.

Another weakness comes from the survey design. For example, the income distribution in the sample is skewed towards higher incomes with too many people having incomes above \$25k. This could lead to inaccuracies in estimating the income distribution of the population as a whole. In addition, the subjective options for measuring happiness level in the survey could introduce bias and inaccuracies in the results. This is because people may have different interpretations of what constitutes "very happy" or "pretty happy," leading to inconsistent responses.

### 2.6 Ethical Concerns & Limitations

The 2021 US General Social Survey has a few issues that should be considered. Since this is a voluntary survey, the appearance of non-sampling errors is inevitable. The type of non-sampling errors in the survey mostly falls into non-response error, where respondents left the answer blank or provide incomplete answers.

There are also ethical factors that should be taken into consideration. Regarding the race of respondents, there are only options for White, Black, and Others. Using "Others" option likely groups other racial identities, therefore could lead to interpretations not accurately capturing the current demographic.

The relatively low response rate of 17.4% may raise concerns about the representativeness of the sample. The reliance on self-selection by respondents may have introduced biases into the sample, as those who choose to participate may have different characteristics or opinions than those who do not. Additionally, the use of mail-based outreach may have led to some surveys being lost or ignored, potentially reducing the representativeness of the sample. Finally, the reliance on web-based responses may have excluded individuals who do not have access to or are not comfortable using the internet, further potentially reducing the representativeness of the sample.

# 3 Discussion

In order to understand the context and trends, we observed the overall trend of happiness of the U.S. population in 2021. We also looked into the distribution of happiness among different age groups, sex groups, and racial groups.

### 3.1 National Happiness

Overall, the level of happiness in the United States in 2021 is relatively high. Figure 1 and Table 1 shows that among 4041 respondents, 77.5% reported that they feel happy and very happy, while 22.3% people were not happy. While the number of people who reported feeling very happy is relatively low compared to those who reported feeling pretty

happy, it still suggests that there is a sizeable portion of the population that is experiencing high levels of happiness. Conversely, the fact that a significant number of respondents reported not feeling happy highlights the importance of addressing mental health and well-being in the United States.

Table 1: The national happiness of the U.S. in 2021

happy	n	proportion
Not too happy	923	22.99452
Pretty happy	2308	57.49875
Very happy	783	19.50673

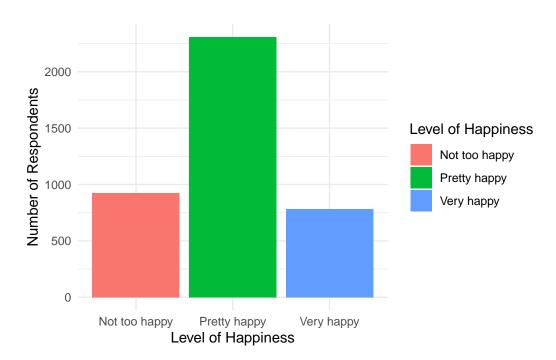


Figure 1: The national happiness of the U.S. in 2021

# 3.2 Happiness among age groups

Comparing happiness among different age groups, it is apparent that the level of happiness remained stable throughout the groups (Figure 2). While in 18 to 64 and non-identifiable age groups, there are more people feeling unhappy than very happy, from 65 and above age group witnesses the same proportion of people feeling not too happy and very happy. In the 18-34 age group, there are 189 respondents (25.9%) reported to feel very happy, while that of 35-49, 50-64, and 65 and above age group take up 22.9%, 23.5%, and 21% respectively.

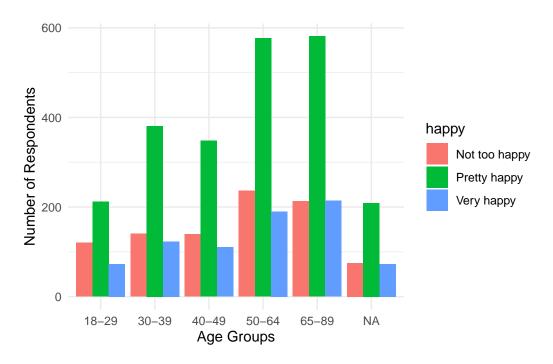


Figure 2: Happiness by age in 2021

# 3.3 Happiness among male, female, and others

Figure 3 shows that male tend to be more happy than female. In the year 2021, the U.S. population reported to be relatively happy among different sex groups. There is a great disparity between female respondents feeling unhappy and very happy - more female experienced unhappiness than very happy, while that of male respondents is quite similar. In addition, there are 92 people who responded their level of happiness without identifying their sex. In this group, there are 62 respondents feel happy, 18 respondents feel very happy, and 12 respondents feel unhappy.

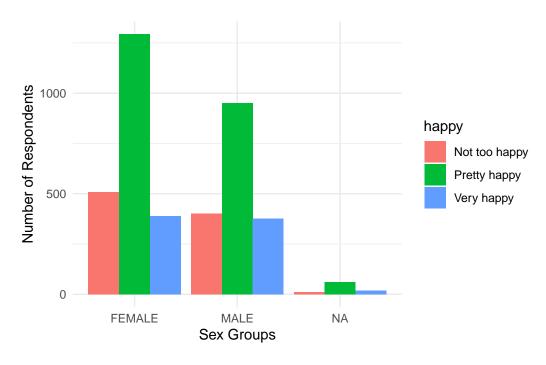


Figure 3: Happiness by sex in 2021

# 3.4 Happiness among different races

As a multicultural country, happiness in different races is also worth observing as it shows the level of happiness in different racial communities. From Figure 4, we notice that there is a similar pattern between the black and white racial groups, and between other races and non-identifiable group. While in people belonged to black and white racial groups felt more unhappy, whom of the other groups showed a contrasting behavior. There are 28.6% of black respondents and 22.7% of the white population feeling unhappy, while that of other races and unidentifiable racial groups took up 18.2% and 14.8% respectively.

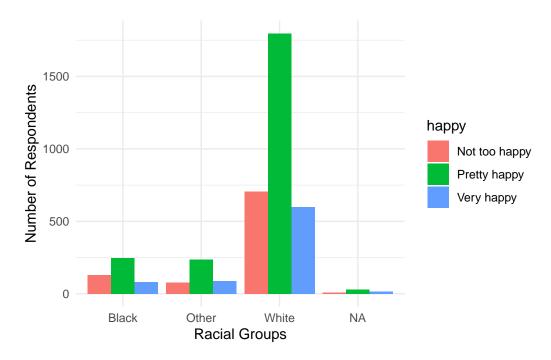


Figure 4: Happiness by race in 2021

### 3.5 Happiness and working hours

Table 2 shows the mean and standard deviation of working hours in different happiness level, as well as the number of respondents of each happiness level. Though the mean of working hours for the very happy group was slightly lower than the rest, the mean hours of people working in the week before they responded to the survey are similar in all levels of happiness, at around 40 hours per week. In addition, it can be told from the standard deviation that the variability of working hours for the three groups are similar. Interestingly, the "pretty happy" group had the largest number of observations among those who responded to all three questions (happiness, working hours, and income level).

Table 2: The means of	hours worked la	st week in differe	nt levels of happiness

Happiness level	Mean (hrs)	Standard Deviation (hrs)	Number of respondents
Not too happy	40.68378	13.04215	370
Pretty happy	40.16744	11.95678	1075
Very happy	39.87363	13.63153	364

### 3.6 Happiness and income level

Figure 5 presents a visualization of the levels of happiness across different income groups.

The data shows that, for most income groups, the highest number of respondents reported feeling "pretty happy" compared to the other two happiness levels. However, there were some exceptions. For individuals earning less than \$1000, their reported happiness levels tended to be more polarized towards "not so happy" and "very happy". Moreover, for those earning between \$6000 and \$6999, the majority reported being "very happy".

Overall, the data suggests that, across income groups, respondents tended towards the "pretty happy" level of happiness. However, it's worth noting that there were variations in happiness levels across different income groups.



Figure 5: Relationship of income level and happiness

### 4 Conclusion

Overall, the level of happiness among Americans is relatively high. We found no significant differences in the distribution of happiness levels across different age groups or races. However, males tended to report higher levels of happiness than females.

In terms of working conditions, we observed that the mean hours worked per week were similar across all levels of happiness. We also found that individuals who responded to all the working condition questions tended to report feeling "pretty happy" across all happiness levels. Income levels did not have a significant impact on the reported levels of happiness.

Our analysis has some limitations. Specifically, we only included respondents who answered all three questions (happiness, income, and working hours) when investigating the relationship between job conditions and happiness. Additionally, we excluded all respondents who did not answer the happiness level question, which may introduce a bias in our analysis. As a result, our research only covers those who are willing to respond to the questions and may not be representative of the broader population.

It is important to note that our analysis is purely descriptive in nature and does not attempt to establish causality or estimate treatment effects. In the future, we plan to conduct inferential statistical analysis to further investigate the relationships between the factors we examined and happiness levels.

# 5 Appendix

# 5.1 Statistics summary

Table 3: The 2021 GSS summary statistics

Variable	N	Percent
sex	4032	
i: Inapplicable	19	0.5%
n: No answer	71	1.8%
s: Skipped on Web	2	0%
FEMALE	2204	54.7%
MALE	1736	43.1%
race	4032	
i: Inapplicable	54	1.3%
Black	463	11.5%
Other	405	10%
White	3110	77.1%
happy	4032	
d: Do not Know/Cannot Choose	1	0%
n: No answer	1	0%
s: Skipped on Web	16	0.4%
Not too happy	923	22.9%
Pretty happy	2308	57.2%
Very happy	783	19.4%

# 5.2 Supplementary survey

Our supplementary survey is available here: https://forms.gle/a7Fx9B1CC9os51yA9

The following images show the screenshots of the online survey form:

# The happiness level of Americans

### Part I: Information Sheet Purpose of the research

Our goal with this survey is to delve deeper into the factors that contribute to happiness. We are particularly interested in gathering more detailed information on identity status, age, race, income, and happiness than what is currently available in the 2021 U.S. GSS data.

### Type of research intervention

The study will contain a questionnaire, which takes up approximately 3 minutes.

#### Participant selection

By participating in this survey, you will be helping us to better understand how demographics and working conditions affect happiness.

# Voluntary participation

Your participation in this study is entirely voluntary. It is your choice whether to participate or not. You can take a break or discontinue participation at any time without giving a reason.

### Risks

There is little to no risk in participating in this research.

### **Data collection procedures**

We will ask you questions about your general information and your happy condition. We will not request, and you should not provide, any sensitive personal information in this study.

### Confidentiality

The information that you provided to us will be treated with care. It will be kept private and not be shared with anyone outside the research group members. Any data, recording or other personal information collected about you will be treated confidentially. The information about you will be numbered instead of your name and will not be given to anyone except the researchers. We may use recordings and notes for internal purposes as we continue to build on our problem identification.

### Who to contact

If you have any questions or concerns about this study or if you wish to withdraw your consent in the future, please email mengze.zhang@mail.utoronto.ca.

### Part II: Certificate of Consent

I have witnessed the accurate reading of the consent form to the potential participant, and the individual has had the opportunity to ask questions. I confirm that the individual has given consent freely.

I give my consent:

- · For the data to be collected
- For individuals of the research team to use the data and notes for internal purposes

By completing this form, you acknowledge that you have read and understood the information in this Research Consent Form.

### **Survey Questions**

1.	What is your immgration status in the United States?
	Mark only one oval.
	US citizen
	Legal Permanent Resident ("green card holder")
	Family petitions
	Employer petitions
	Violence Against Women Act self-petitions (of any gender)
	Conditional Permanent Resident
	Asylee or Refugee
	Non-immigrant (a person with a visa that is good only for a specific duration)
	Undocumneted Resident
	None of the above (I'm not currently located within the United States)
	Prefer not to say

2.	What is your biological sex?
	Mark only one oval.
	Male
	Female
	Prefer not to say
3.	How old are you?
	Mark only one oval.
	Below 14 years
	15-24 years
	25-34 years
	35-44 years
	45-54 years
	55-64 years
	65 years and older
	Prefer not to say

4.	What racial group do you belong to?
	Mark only one oval.
	White
	Hispanic and Latino
	Black or African American
	Asian
	Two or more races
	Native American or Alaska Native
	Native Hawaiian or Other Pacific Islander
	Some other race
	Prefer not to say
	Mark only one oval.  Lower than \$10,000 \$10,000 to 19,999 \$20,000 to 29,999 \$30,000 to 39,999 \$40,000 to 49,999 \$50,000 to 59,999 \$60,000 to 69,999 \$70,000 to 79,999 \$80,000 to 89,999
	\$90,000 to 99,999
	More than \$100,000
	I don't have any income.
	Prefer not to say

6.	How many hours did you work last week? (If this question does not apply to you, please put N/A in the box provided.)
7.	How happy do you feel these days  Mark only one oval.  1 2 3 4 5
	Not Very happy
8.	Which of the following things do you consider will contribute to your happiness?  Tick all that apply.  Family  Friends & Social Connections  Love/Partner  Material Possession  Achievement  Health  Other:
T	hank you for your participation!
	you have any questions or want to reach out to us, you can contact us at <a href="mailto:lengze.zhang@mail.utoronto.ca">lengze.zhang@mail.utoronto.ca</a> .

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Google Forms

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