Project Report

An Investigation into How the Declining Fertility Problem Featured in Taiwan's 2022 Mayoral Election

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1. Introduction

- 1.1 In 2022, Taiwan registered a record low fertility rate of 0.87. It is projected that by 2035, Taiwan will have the lowest fertility rate in the world (Tzu-Ti, H., 2022). The issue has also become one of the hot topics during the mayoral election last year. The 2022 mayoral candidates have put forward various strategies and policy proposals to tackle the issue.
- 1.2 This project seeks to ascertain how the issue of low fertility rates factored into the 2022 local elections. Of which, we aim to better understand the candidates' outlooks relating to the issue and their proposed solutions to how Taiwan can address the decreasing fertility problem. Focusing on Taiwan's six special municipalities (i.e. Taipei, New Taipei, Taoyuan, Taichung, Tainan, and Kaohsiung), we ask the following three research questions.
 - a) How frequently did the candidates mention the issue on Facebook?
 - b) What policy ideas did they propose to resolve the issue?
 - c) How does this compare to discussions and perceptions in the media?
- 1.3 Initially, we also planned to employ ChatGPT (3.5) for our analysis. However, after manually labelling 300 posts, we found that ChatGPT's accuracy is not high enough (See **Appendix A** for details). Therefore, we adjusted our methodology to include informed keyword searches of the candidate posts, in addition to a word cloud of the candidate posts and news articles.
- 1.4 We have written this report so that it can be read in tandem with the <u>GitHub</u> repository, and have also embedded the direct links to the relevant files and folders in GitHub within the report for easier reference.

2. Methodology and Data Source

2.1 Data Source

- 2.1.1 In the study, we have chosen to further study the content that was posted by fifteen leading candidates from the six special municipalities. This includes candidates from the Kuomintang (KMT) and Democratic Progressive Party (DPP)¹, as well as Taiwan People's Party (TPP)'s Taoyuan candidate Lai Hsiang-ling(賴香伶) and Taipei's independent candidate Huang Shan-shan(黃珊珊). In addition, we looked at the online news articles that relate to the issue of declining birth rate. The data sources are summarised as follow:
 - a) **Facebook Posts** The Facebook posts were obtained from the verified Facebook accounts of the 15 mayoral candidates via Crowdtangle. Based on the respective party's public announcements and available reports, the period of posts covered the candidates' nomination dates to the date after the election i.e. 2022/02/11 to 2022/11/27², totaling 5,825 posts. The candidate periods are included in **Appendix B**.
 - b) Online News Articles from Wisenews To get a sensing of the issues discussed in association with the declining birth rate in Taiwan, we used the keywords "台灣" "生育率" OR "少子化" "台灣". The period covered the nomination date of the first candidate until the day after the election: 2022/02/11 to 2022/11/27. Using this, we obtained 4,197 news articles from the wisenews dataset. After data cleaning, 3,917 articles remained. The news articles can be found on the repository.

¹ In Taoyuan, Cheng Yun-peng replaced Lin Chih-chien as DPP's candidate in August 2022. For completeness, we have taken into account both candidates in the study.

² We have included the day after the elections as some of the candidates may also reiterate some of their election promises and immediate priorities upon the release of the election results.

c) Additional Supplementary Information - To refine the keywords used for the analysis, we referred to both the official election bulletin (選舉公報) that contained the policy proposals of the candidates published from Central Election Commission (中選會), as well as the official policy documents and announcements from the National Development Council (國發會), Executive Yuan (行政院) and Six Municipal Governments (市政府). The keyword determination will be explained further in Section 2.3.

2.2 Data Cleaning

2.2.1 For the **Facebook posts**, we downloaded a single CSV file containing all of the fifteen candidate' Facebook posts using Crowdtangle. We first downloaded all the candidates' posts from 2022/02/11 to 2022/11/27. The data preprocessing and data cleaning process reduced the number of articles from 8,073 to 5,802. We deleted so many posts because our initial csv file (FB_All_Candidates.csv) also included candidates' posts from *before* they started running; these had to be deleted. We preprocessed and cleaned the data with the following steps³:

Data Pre-processing

 Rbind the dataframe with candidates another dataframe that contains more information about each candidate (e.g. Party, City, Started Running Date, English name, etc.). We collected this additional data manually. The excel sheet can be found here.

³ The codes can be found in main code.r, line 22-91.

- Delete all the posts from the period before a certain candidate started running. For example, Huang Shan-shan (黃珊珊) announced that she was running for mayor on August 28, so we deleted all of her posts from 2022/02/11 until August 27. We did this for each candidate.
- Delete the posts after 2022/08/17 for candidate Lin Chih-chien (林智堅) who was replaced by Cheng Yun-peng (鄭運鵬) in Taoyuan on that day. After these first few steps, we saved the df as a new master file so these lengthy steps can be skipped in the future. See <u>master_candidate_posts.csv</u>.

Data cleaning

- Select the important columns e.g. (Page.Name, Message, Image.Text, Description).
- Merge all the columns that may contain the candidates' posts into a single 'Content' column. The candidates' posts usually appear in the Message column. However, they may sometimes also appear in the Image. Text or Description column. By adding the contents of these columns into a single 'Content' column we can be certain we will not miss anything important.
- Clean the rows that contained 'NA's, including those that had videos or photos without text.
- 2.2.2 For the **news articles**, we downloaded the 4197 news articles in pdf format⁴ from 2022/02/11 to 2022/11/27. The data preprocessing and data cleaning process reduced the number of articles from 4197 to 3917. We used the following steps to preprocess and clean the data.⁵

⁴ The PDF file was the cleanest data compared to the other formats.

⁵ The codes can be found in <u>Wisenews.R</u>, line 13-69.

- Convert to text with the R package 'pdftools'.
- Split text based patterns "文章編號:" and put the list into a dataframe. This pattern can be found at the end of each article so this will return a dataframe with a separate article in each row.
- Create a date column and extract the date of each article by using the publication data that is located between "|" and "網站".
- We removed the unnecessary information (e.g. disclaimer text, links) at the start of each article by first deleting everything up to the pattern that introduces the link "文字 快照", and then by deleting everything up to the first Chinese character (because the links are in letters). This was easier than writing several regexes for different link formats.
- Remove empty rows and compressed articles. We discovered that there were several articles that had been compressed to ~150 characters. We decided to delete all of the articles that contain three periods at the end '. . .' AND contain less than 200 characters. In addition we also deleted the empty rows.

2.3 Identifying Keywords For Analysis

2.3.1 Keywords for Cross-Topic Comparison

2.3.1.1 There were two important sets of keywords that were used for the analysis, with the first being the keywords for the different issues that were mentioned by the candidates on Facebook. To establish the topics, we took reference from an article by Taiwan Reporter 報導者 published on 17 November 2022. In the article, the author studied the policy

proposal of leading candidates from the six direct municipalities (嚴文廷, 2022). Through consultation and interviews with various NGOs, the author identified four key long-term issues that are most relevant and of interest to the six municipalities including public housing (社會住宅), child and infant care (幼托政策), eldercare (長照) and green transportation (綠色運輸). Taking this into consideration, we identified the following categories that we will use for the comparison - (1) Eldercare; (2) Public Housing; (3) Fertility; (4) Transport and (5) Economy. The last topic was added as economic issues remain an important topic that is discussed as well.

Next, we derived the keywords by taking reference to the specific terms relating to the issue or policy that are mentioned in the respective candidates' election bulletin (選舉公報), which captures both commonly-used terminologies, as well as the terms that take into account the local context (e.g. local projects or initiatives). We also added other more common terms that we have found from our observations from the candidates facebook posts when they mention the related issues. The keywords are in **Appendix C**.

2.3.2 Keywords for Comparing Specific Policy Directions to Increase the Fertility Rate

2.3.2.1 The second set of keywords pertained to the specific policy directions or sub-topics relating to fertility that were mentioned by the candidates. In our study on fertility solutions, we conducted a keyword search using terms extracted from the policy terminology found in official government policy planning reports. The primary documents we referred to were the "Enhancing the Parenting Environment Program" (國發會, 2016) published in 2016 and the "National Care for 0-6 Years" (行政院, 2023) by the Executive Yuan (行政院) in 2023. In order to ensure comprehensive coverage, we also included keywords from the "National Together for 0-6 Years - Encouraging Youth to Marry, Embrace Parenthood" report.

- Our objective in the fertility solution keyword search was to gain insights into how the Wisenews dataset and Facebook posts primarily discussed fertility solutions. Here, we had adjusted the policy categories that were originally included in the National Development Council's document from three to four. This takes into account that a keyword search using the original category may result in an overlap in posts. For example, a keyword search using the term "公托" or "托育" may results in both supply side policies to expand the number of childcare centres, as well as demand side policies such as subsidies given to the second or third child to offset the parent's childcare costs. As such, we adjusted the policy directions into four categories (1) Childcare; (2) Financial Aid; (3) Infertility; and (4) Workplace. Broadly, the keywords, which are included in Appendix D, cover the following issues:
 - Childcare Includes both supply-side targeted at expanding centre-based or home-based childcare services, and demand-side childcare subsidies for parents.
 - Financial Aid Includes other types of subsidies or financial incentives to encourage
 parenthood such as maternity allowances, contributions to future education accounts,
 etc.
 - Infertility Includes measures that are related to pregnancy and infertility such as in vitro fertilisation, egg freezing etc.
 - Workplace Includes measures that help to create a family-friendly workplace, such
 as provision of maternity and paternity leave, creating a corporate childcare and
 lactation room within the workplace etc.

2.3.3 Establishing the Word Cloud, Stop Words and Custom Dictionary

2.3.3.1 For the word clouds, we followed the <u>tutorial provided by NTNU</u>. Our code uses the Jiebar package for tokenization, a stopword list from the <u>stopwords-zh</u> repository (converted to traditional), and a <u>custom dictionary</u> that we compiled ourselves. It contains all of our keywords and other important words such as political parties. Furthermore, we also added custom stopwords that we believed not to be very informative. Firstly, words like 少子 化 (ageing population) do not tell you much about what the candidates or the news think about these subjects. Secondly, common forms of address used by politicians like 市民 (residents) or names of cities are also not very informative. Thirdly, even though we conducted thorough data cleaning, some of the wisenews articles still contained words that denoted to what category the article belongs, like 經濟 (economy) or 科技 (technology); we removed these terms. Finally, every text will always include words that slipped through the stopword list, like 今天 (today) or 指出 (point out). The full additional stop word list can be found here.

3. Analysis and Findings

3.1 How frequently did the candidates mention the fertility topic?

3.1.1 In our analysis of the Facebook posts made by candidates from six municipalities using our Keywords for Cross-Topic Comparison, we discovered that the economy and transport issues were the most prominent topics, followed by fertility issues as depicted in Figure 1. This

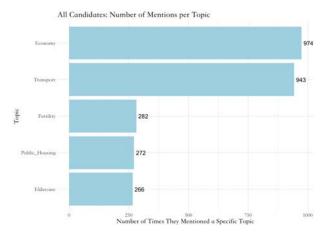


Fig. 1 All Candidate Number of Mention per Topic

finding raises an interesting observation that despite the strategic importance of the fertility problem, candidates might prioritise addressing economic and transport concerns to garner voter attention. Delving deeper into our primary focus on fertility problems, we further examined the candidates' total number of posts specifically related to this issue. As illustrated in Figure 2 and Figure 3, DPP's Taoyuan and Kaohsiung candidates Cheng Yun-peng(鄭運鵬) and Chen Chi-mai (陳其邁) ranked amongst the top three both in terms of the total number of posts and the average daily mentions, with KMT's Hou You-yi (侯友宜) ranking the lowest in both. The average daily mentions also considers the duration of a candidate's campaign.

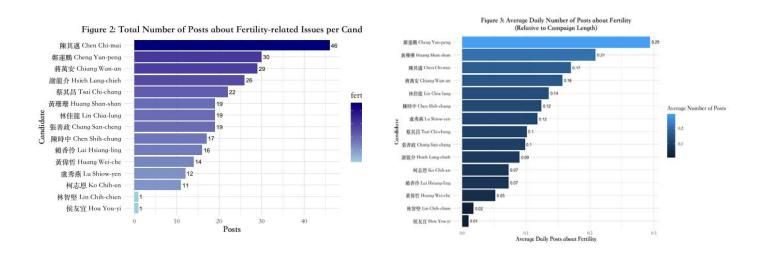


Fig. 2 Total Number of Fertility Post by Candidates

Fig. 3 Average Daily Fertility Post by Candidates

3.1.2 The ranking of **Cheng Yun-peng of Taoyuan City** can be attributed to the prominence of Taoyuan City during the 2022 elections, especially as both the incumbent DPP mayor Cheng Wen-tsan (鄭文燦) and original DPP candidate Lin Chih-chien were both

embroiled in plagiarism controversies in the lead-up to the elections. In addition to profiling the DPP Government and incumbent Taoyuan mayor's policies positively, Cheng Yun-peng often emphasises how he has received strong support from President Tsai Ing-wen (蔡英文), Vice-President Lai Ching-te (賴清德) and then-Premier Su Tseng-chang (蘇貞昌), and will continue to work for the people of Taoyuan if he is elected. Notably, pro-family and fertility-related policies were among the key issues that Cheng Yun-peng had focused on for his campaign. He often emphasised the achievements made by then-mayor Cheng Wen-tsan that had enabled Taoyuan to become the special municipality with the highest fertility rate.



Fig. 4: Emphasis of Strong Support from the DPP Top Leadership in Cheng Yun-peng's Facebook Posts

Fig. 5: Highlights of the incumbent's DPP mayor's achievements, especially fertility, was a key feature

3.1.3 In the context of Kaohsiung City, the mayoral election featured incumbent candidate

Chen Chi-mai seeking re-election. An intriguing observation arose regarding the level of

engagement demonstrated by Chen Chi-mai in addressing the issue of fertility problems, which significantly surpassed that of his opponent, Ko Chih-en (柯志恩) from the KMT party. While Chen Chi-mai mentioned the issue numerous times, Ko Chih-en only made 11 references to fertility problems. This notable discrepancy highlights a substantial difference in the candidates' prioritisation of addressing fertility problems within their respective campaigns.

3.1.4 Figure 6 provides further insights into Chen Chi-mai's approach to the topic. One of his posts specifically highlighted the establishment of a new childcare centre and promoted the fertility allowance and policy offered in Kaohsiung City. This post stands out as a direct and explicit reference to fertility policy. In contrast, Ko Chih-en, although posting less frequently on Facebook, contributed by participating in a live stream video addressing fertility problems. This demonstrates a difference in the candidates' strategies, as Chen Chi-mai did not engage in a live show specifically dedicated to fertility policy. Additionally, it is noteworthy that Chen Chi-mai's posts often contained detailed policy information, while Ko Chih-en primarily shared her personal sentiments and emotions regarding various events.



Fig. 6: Post on further insights into Chen Chi-mai and Ko Chih-en's fertility policy approach



公園裡充滿了孩子們的笑聲,不只歡樂,也能帶給許多家庭幸福美好的記憶。

改變公園氛圍, #共融遊戲場 是帶給台灣社會一個最大、最重要的意義。四年前我和市府團隊到 北歐考察,我看到北歐很多的全齡化特色共融公園做得很好,值得向他們學習。

我擔任新北市長後,決心把握當下,許下四年努力達成100座的特色共融暨全龄化公園的目標, 四年下來,在團隊的全心投入下,我們已經完成了108座全龄化特色共融公園,累計改善達163 座,超越了原本設定的100座目標,為的就是希望讓所有人在遊戲場裡都找能到平等活動的空間,讓身障的孩子也能與一般的孩子玩在一起。

有位媽媽還特別和我分享,家裡有需要坐輪椅的孩童,在市府推動共融公園的友善環境後,終於 也可以到公園與其他小朋友一起玩,讓孩子們從小就可以認識到不同的族群,長大以後可以去同 理他人。我聽了感到相當欣慰,對的事,我們一定全力以赴,市府團隊的每一滴汗水、每一分勞 力,都有著讓人民安居樂棄的非凡意義啊!

在行程的路途中,只要經過公園,看見孩子們的笑顏、看見家長和孩子輕鬆享受悠閒的親子時 光,瞬間疲勞全消除,一切努力的成果都值得孩子們擁有。

「用得到的,才是你的」,因為有市民的參與及使用,這些改善的成果終將被看見;有市民的融入才能凸顯新北公園的個性,身為市長,我一定會更加努力地守護每一位民眾,讓你們在友善的環境紀錄下屬於自己的美好回憶,讓每一個人的笑容不斷綻放!



Fig. 7: Post on family-friendly park evening attended by Hou You-vi

3.1.5 For Hou You-yi of New Taipei

City who had the least post amongst all candidates, we observe that he was generally not as active as the rest of the candidates on Facebook, with his posts usually associated with the events that he attended, the major festivals or incidents that occurred. Of which, the only post that was related to family and fertility was related to the opening of a family-friendly park which he attended October 2022. As Hou consistently enjoyed a high rating over his DPP candidate in the lead-up to the

elections, this could be a reason for the lower post count for Hou on Facebook, as there may be less need to articulate the policies given his high ratings (黃韋銓, 2022).

3.2 What policy ideas did the candidates offer to solve the declining fertility problem?

3.2.1 The issue of low fertility is of significant importance, and addressing this problem requires considering various potential policies that based the may vary on background, demographics, and population situation of each city. In this study, we employed the Keywords for Comparing Sub-Topics on Fertility Policy to analyze the Facebook post data we collected. Overall, we observe that childcare-related policies were the most mentioned policies by all candidates (and in turn all cities). The exception was Tainan, where issues relating childcare and financial aid were discussed almost in the same volume.

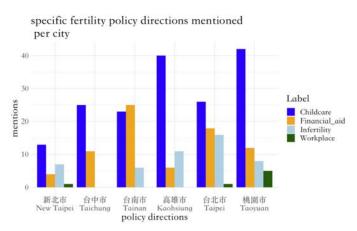


Fig. 8 Fertility Policy Post Number by City

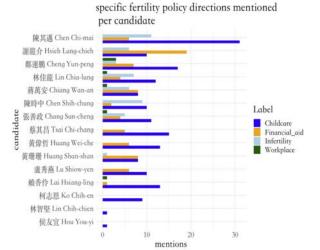


Fig. 9 Fertility Policy Mention by Candidate

3.2.2 The high mention of **childcare related policies** reflects the longstanding issue of the under supply of childcare services and high childcare costs that is prevalent in Taiwan (陳星穎, 2021). We observe that candidates have used dedicated posts to highlight the achievements and public spending towards childcare related policies that have been made over the previous term (e.g. by incumbent candidates such as Lu Shiow-yen, Chen Chi-mai, Huang Wei-che), as well as the policy plans going forward, such as increasing the ratio of public childcare services and subsidies to make the services more affordable for parents.



Fig.10 Dedicated Posts by both Incumbent Candidates (e.g. Chen Chi-mai, Lu Shiow-yen) and Contenders (e.g. Cheng Yun-peng, Lin Chia-lung, Lai Hsiang-ling, Chang San-cheng) on childcare-related policies and achievements

3.2.3 Here, we also investigated the anomaly results of findings where **financial aid** was mentioned significantly in Tainan. The focus on financial aid issues is mainly attributed by Hsieh Lung-chieh (謝龍介)'s posts, where we observed that the provision of subsidies across various issues (e.g. eldercare, education, school bento boxes, childcare, diapers) was a major policy promise that he had put out during his campaign. Emphasising how Tainan had the ageing population and the lowest birth rate amongst the six municipalities, Hsieh Lung-chieh has often criticised the incumbent DPP mayor and pushed hard to attract support from the electorate.



Fig. 11 Emphasis of Subsidies and the low birth rate in Tainan as a major campaign theme by KMT candidate 謝龍介

3.2.4 With regard to the categories of **infertility and workplace policy**, we observed a lower frequency of mentions compared to the aforementioned categories. One possible

explanation for this could be attributed to the limited authority of local governments in amending labor laws. This notion is supported by the 我國少子女化對策107-111年 (Measures to Address the Decline in Birth Rate in Taiwan, 2018-2022) report published by the Executive Yuan. According to the report, workplace policy falls under the jurisdiction of the Ministry of Labor and the Ministry of Technology, both of which are controlled by the Central gGovernment. This may account for the relatively fewer posts related to workplace policies by candidates, as they may have limited influence in this area. Additionally, the Ministry of Health and Welfare is responsible for infertility policy, indicating that although potential fertility policies may vary, mayoral candidates have limited authority in directly promoting workplace and infertility policies, resulting in a lower number of mentions in these areas. Conversely, childcare-related policies and financial aid policies are directly linked to local governments, and candidates can more readily engage with these topics as well as allocate funding at the local government level.

3.2.5 Nonetheless, we still observe that some of the candidates have mentioned these two issues. One possible reason could potentially be related to the ageing population in Taiwan, one that may result in an increase in the incidence of infertility and hence the need for the necessary diagnosis and treatment. At the same time, women candidates such as Huang Shan-shan have also touched on the promotion of greater gender equity in Taiwan, including through implementation of paternity leave to encourage fathers to be able to take up responsibility in taking care of the children.





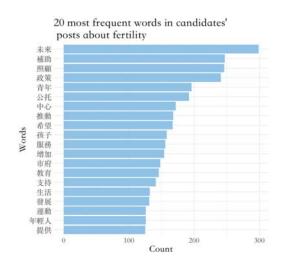
Fig. 12 Mention of support for couples facing infertility problems by Chiang Wan-an and Chen Shih-chung, and advocating for greater gender equality including through paternity leave by Huang Shan-shan

- 3.3 How did the candidates' perception of the declining fertility issue compare to the media perceptions and discussions?
- 3.3.1 We compared the candidate's Facebook posts to the broader media discussions in relation to Taiwan's declining fertility rate. This can help us to better understand the underlying narratives surrounding the issue, and assess the role of media in shaping public perceptions.
- 3.3.2 Figures 13-17 shows the word clouds and the 20 most frequent words in the fertility-related posts by Candidates, as well as the news articles. Broadly, we can observe that the media mostly considered how Taiwan's declining fertility rate may impact different aspects of society, such as education (e.g. university closures), labour shortages, and industrial development. The candidates, however, focused more on the achievements and policies that they have put forward to address the declining fertility problem, such as expanding child and infant care services, and related subsidies. This corresponds with the observations that we have found in the previous sections on the posts by candidates.



Fig. 13 Wordcloud showing to the most common terms that are within the fertility-related Facebook posts of candidates

Fig. 14 Wordcloud showing to the most common terms that are within the fertility-related media articles



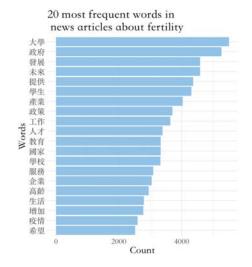


Fig. 15 Top 20 most Frequent Words on Candidate Posts

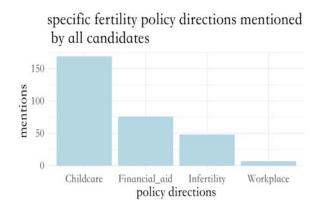
Fig. 16 Top 20 most Frequent Words in Media

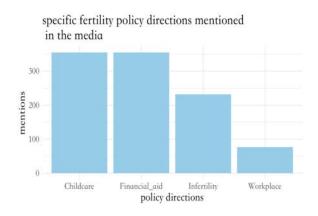
	Comparison of the top 20 most frequent words from the news articles and candidates' facebook posts							
1	Common words	未來、提供、希望、發展、教育、生活、增加						
2	Wisenews articles only	Education-related: 大學、學生、學校 Industry-related: 產業、工作、人才、企業 Ageing population related: 高齡 Policy-related: 政府、政策、國家、服務 Others: 疫情						
3	Candidate posts only	Target audience: 年輕人、青年、孩子 Subsidies: 補助 Care service: 公托、中心、照顧、服務、 Policy implementers or pushers: 市府、政策、推動、支持 Others: 運動						

Fig. 17 Categorisation of the Top 20 Words

3.3.3 Another interesting observation that we found was that childcare policies (e.g. expansion of public infant care, providing childcare subsidies) were the most mentioned issues by both candidates on Facebook and the media. However, financial incentives (e.g.

incentives to encourage child bearing) were mentioned in the same frequency as that of child-care policies within the media. There was also a significant mention of infertility-related issues by both candidates and media.





candidates' fertility-related Facebook posts

Fig. 18 Comparison of the mentions of issues within the Fig. 19 Comparison of the mentions of issues within the fertility-related news articles

4. **Project Limitation and Future Research Possibilities**

4.1 **Project Limitations**

4.1.1 For consistency purposes, the project has analysed only the Facebook posts that took place during the candidature period of the individual candidates. As such, this may skew the results as some candidates may appear to have a larger quantity of policy mentions due to the fact that he/she have started the election campaign at an earlier date. Within the study, we have tried to make a fairer comparison by using the average data (e.g. average daily post by candidate) or to compare the different mentions of topics within the same candidate. Nonetheless, due to the differences in the candidature periods, there may still be a chance that we may not fully capture the complete picture of all of the policies put forth by the candidates, some of which may take place prior to the candidature announcements. Also, it is

important to remember that our analysis is limited to candidates' Facebook posts. Some candidates are more active than others, and some candidates might not put all of their policy ideas on Facebook. This research should therefore be considered as a research into how candidates engaged with the low fertility rate issue on Facebook, not in their entire campaign.

4.1.2 Due to the limitations of the keyword search, we have had to combine the keywords such as those relating to both the demand-side and supply-side policies for the childcare services so as to minimise the double-counting of results. Hence, we were unable to break down the findings into the finer categories. Also, the keyword search results were very much dependent on the qualitative research that we had done and the quality of keywords used. Here, we have tried our best to include a comprehensive list of keywords that pertain to the issues and policies analysed, nonetheless there could still be a possibility that some of the keywords may be missed out. Hence, we will need to continually update the list if we were to undertake the study over a longer term period.

4.2 Future Research Possibilities

4.2.1 There are several ways that we can further extend the research. First, we can extend the analysis beyond the six special municipalities to cover all of the entire of Taiwan. The bigger dataset could allow us to analyse the data in more ways, such as to do a comparison between urban-rural areas, or between incumbents-contenders, or even to undertake a deeper analysis into the content of the candidates vis-a-vis the political party lines. For the latter, we could even go further to look at multiple election cycles to look at the different factors that may influence the type of posts, issues and even the angling that are used by the different candidates. Second, during the poster presentation, one of the feedback that we received from the industry experts was how the data could potentially be translated into the data-driven

articles that are published. Here, we could further supplement the data with additionally qualitative information such as through interviews with the candidates to better understand their policy positions, or with experts to better understand the context behind some of the observations that we have obtained. Third, as our study had only focused on fertility-related issues, we could also do a deeper dive into some of the other issues that have not been discussed in detail, such as economy, transport and public housing, which are important issues that people in Taiwan are also concerned about today.

5. Conclusion

- 5.1 The project has provided insights into the discussion and proposed solutions put forth by the leading candidates of the six special municipalities in relation to the declining fertility issue faced by Taiwan. Despite the strategic importance of the declining fertility problem in Taiwan, we noted that the amount of mentions by candidates ranked lower than that of economy and transportation. Within fertility-issues, childcare-related policies received the highest mention amongst the different fertility-related policies, which also reflects the long standing nature of the issue in Taiwan.
- 5.2 The study has also provided additional insights to other factors that may affect how significant the issue is discussed by the various candidates, such as the role of the candidate (as the contender and incumbent), the prominence of the city during the elections (such as in the case of Taoyuan which was among the most discussed), as well as the other issues that may be discussed. We hope that the study can be useful to both (i) readers or organisations who are interested in the policies and solutions that could tackle the issue of declining fertility; (ii) readers who may be interested in understanding the social media strategies and

campaigns in candidates in Taiwan; as well as (iii) students who are interested in using data tools for policy and social media analysis.

6. **Appendix**

6.1 Appendix A: Initial Feasibility Study Relating to the Use of ChatGPT (3.5)

6.1.1 We tested ChatGPT (3.5) ability to assist us in our tasks and found that its accuracy

was below standards. It appears that ChatGPT is unable to process long Chinese Facebook

posts. We ran some manual tests with the GPT-4 web edition, which returned much more

impressive results. However, we had no access to the GPT-4 API, which made large-scale,

systematic testing unfeasible. We tested ChatGPT on the three different tasks outlined below:

Assessing if specific posts are about fertility or not

Since our initial keyword search returned some posts that were actually unrelated to

fertility, we decided to test if ChatGPT would be able to verify if posts were actually related

to fertility or not. Because we could not rely on ChatGPT to do this task for us. We ended up

taking out the word 孕育 and 育 because they returned too many results that were not related

to our topic.

Manually labelled: 105

Accuracy: 0.514

Prompt:

"system", content = "you are a researcher that judges whether a bunch of posts mention a certain topic. You only respond with 1 and 0"), "user", content = paste0("judge wether the following posts are related to the eageing population, childbirth, policies related to small children or any other policies aimed at creating a better environment to raise children, like subsidies or improved daycare.

if yes, give me 1. if it is completely unrelated. give me 0. do not give me anything else.

this is the post:" , fertcheck\$Message[i])))

Finding relevant importance vis-a-vis other topics

We used the same five categories as we employed in the report above and added the

category 'other'. We then asked ChatGPT to conduct text classification.

26

Manually labelled: 106

Accuracy: 0.481

Prompt:

"system", content = "you are a researcher that does text classification in facebook posts related to the elections, you only respond with numbers"),
"user", content = paste0("categorize the following posts based on the following labels only give me the numbers. if there are multiple labels,

note it like this 1, 3, 5

'社會住宅': '1' anything related to public housing or making housing more affordable '幼托政策': '2' anything related to creating a better environment for little childeren and ideas

that aim to boost the birth rate by encouraging people to have kids (subsidies, medical treatments, etc.) '長照政策': '3', anything related to care for the elderly

'運輸': '4', anything related to transportation (public transport, but also traffic)
'經濟發展': '5', anything related to companies that are trying
'other': '6' literally anything else. this is the post:" , topics_df\$Message[i])))

Differentiating between different specific policy directions

6.1.4 Disclaimer: At the start of this project we initially settled upon three other labels to

further analyse the specific policy directions. We decided to change these into four different

labels later in the project and decided not to do a manual labelling again because we are

already certain that ChatGPT's results would not be good enough to use. Nevertheless, we

still decided to include this test with ChatGPT because it may be useful for others who wish

to use it for similar purposes.

6.1.5 After an elaborate review of government websites we set upon the following three

policy directions. These are in line with the policy directions that the government uses. This

appeared to be the most difficult task for ChatGPT to solve because there is some overlap

between policies. We tried several different prompts but none of them yielded any proper

results.

Manually labelled: 90

Accuracy: 0.233

Prompt:

27

```
"system", content = "you are a researcher that does text classification in facebook posts related to 生育率、you only answer with numbers"),
"user", content = paste0("what kind of policy direction does the following post offer to solve the problem.
label 1 友善觀場: examples include: 安胎假、產橙假,產假、陪產假,育變留職停虧,家庭照顧假,也無托育設施或措施.

label 2 經濟支持: examples include: 妊娠生產醫療給付,各類保險生育給付,地方政府生育津贴,地方政府低收入戶生,育補助+
育變留職停虧津贴、就業者家庭部分托育,費用補助,特殊塊鹽家庭兒童托育津贴補助,
未就業家庭育兒津贴、幼兒學期特別扣除額,中低收入戶幼兒就學補助,
5 歲幼兒免,學費故學補助,兒童與少年未來教育及發展傾戶(0-未滿 18 歲),
特殊境遇家庭子女生活津贴補助(0-15 歲以下),
弱勢家庭兒童及少年緊急生活扶助(0-未滿 18 歲)+
弱勢兒童及少年生活扶助。3 歲以下兒童鹽夜補助,發展媽媛兒童商育及交通費補助發展,中低收入戶兒童及少年健保費補助(0-未滿 18 歲).

label 3 教保環境:examples include: 孕產婦關懷中心,產前健康檢查,公立幼兒園、非營利幼兒園,公私協力托要中心,托育資源中心,居家式托育服務,兒童預防保健服務(0-未滿 7 歲),收出養媒合及畜養安置,兒童三級預防措施,防治兒店事件.

label 4: other: anything else

label 5 no specific policy mentioned: only mentions the problem of 少子化 but does not offer a specific solution only answer the right numbers, like this: 1. if there are two labels give me something like: 2, 3. do not write anything else. this is the post:", fertsolutions?Message[i])))
```

Costs

6.1.6 We ended up making 485 requests. This cost us \$1.33. If we had used the GPT4-8k api these costs would have been multiplied by 15 (\$19.95). We would need to make a total of roughly 6300 requests in order to label all of the data in our dataset. This means that using ChatGPT for the whole project would have cost \$15.96. GPT4-8k would have cost \$259.

Conclusion

6.1.7 It appears that ChatGPT (3.5) is unable to perform reliable classification tasks on long Chinese texts. GPT4 will likely perform better but the costs are simply not worth it. It may be better to rely on more reliable, faster, and cheaper models like BERT.

6.2 Appendix B: Candidature Periods for Candidates

SN	Municipality	Party	Candidate	English Name	Date Started Running
1	Taipei	KMT	蔣萬安	Chiang Wan-an	26-05-2022
2	Taipei	INDP	黄珊珊	Huang Shan-shan	28-08-2022
3	Taipei	DPP	陳時中	Chen Shih-chung	13-07-2022
4	New Taipei	DPP	林佳龍	Lin Chia-lung	10-07-2022
5	New Taipei	KMT	侯友宜	Hou You-yi	17-08-2022
6	Taoyuan	KMT	張善政	Chang San-cheng	18-05-2022
7	Taoyuan	DPP	林志堅*	Lin Chih-chien*	22-06-2022
8	Taoyuan	DPP	鄭運鵬	Cheng Yun-peng	17-08-2022
9	Taoyuan	TPP	賴香伶	Lai Hsiang-ling	21-04-2022
10	Taichung	KMT	盧秀燕	Lu Shiow-yen	17-08-2022
11	Taichung	DPP	蔡其昌	Tsai Chi-chang	24-04-2022
12	Tainan	DPP	黄偉哲	Huang Wei-che	02-03-2022
13	Tainan	KMT	謝龍介	Hsieh Lung-chieh	11-02-2022
14	Kaohsiung	DPP	陳其邁	Chen Chi-mai	02-03-2022
15	Kaohsiung	KMT	柯志恩	Ko Chih-en	29-06-2022

^{*} Cheng Yun-peng replaced Lin Chih-chien as DPP's mayoral candidate for Taoyuan before the elections. As such, we have only taken Lin Chih-chien's posts during the period of running.

6.3 Appendix C: Keywords used for comparison of fertility with other issues

SN	Category
1	keywords_Eldercare <- c("銀髮族", "長照", "在地安佬", "在地老化", "不老城", "重陽敬
	老金","老人健保","無障礙公車","日照","銀髮樂活","敬老卡","高齡運動")
2	keywords_Public_Housing <- c("居住正義", "社會住宅", "社宅", "租屋", "青銀共居", "
	捷運社宅","台中好宅","老屋翻新","包租代管","囤房特別稅","社宅")
3	keywords_Fertility <- c("少子化", "生育率", "生育", "生孩子", "懷孕", "育兒", "育嬰", "
	新生兒", "托嬰", "公托", "臨托", "產檢安胎假", "陪產假", "產檢假", "育嬰留職停薪",
	"生理假", "企業托育", "聯合托育", "企業哺乳室", "生育獎勵", "嬰兒補助", "育兒津貼
	","育兒補助","生養津貼","生養補助","生育津貼","生育補助","育嬰留職停薪津貼
	","就學補助","就寫津貼","幼兒學前特別扣除額","免學費","育嬰留職停薪津貼","
	未來教育及發展帳戶","公托","公幼","托育","收托","送托","托嬰","夜托","臨托",
	"教保服務","教保人員","社區保母","在校安親班","準公共機制","平價就學場域","
	平價名額","兒童預防保健服務0-未滿7歲","收出養媒合","養安置","兒童三級預防
	措施", "防治兒虐事件", "懷孕以及孕婦相關", "不孕症", "試管嬰兒", "不孕夫", "凍卵
	","坐月子","產檢","孕產婦關懷中心","產前健康檢查")
4	keywords_Transport <-c("鐵路", "鐵路地下化", "Youbike", "YouBike", "捷運", "腳踏車
	","自行車","公車","車禍","幸福里程","通勤","大眾運輸","步行","國道","客運轉
	運站", "公車", "交通", "運輸套票", "智慧交通", "機車路權", "軌道捷運", "iBike", "幹
	道", "輕軌", "台中大環", "閘道", "不塞車", "Tbike", "人行道", "電動公車", "自行車質
	量", "聯外道路", "人行安全", "行人安全", "人性化路牌", "智慧街道", "四橫三路", "道
	路壅塞", "外環道路", "鐵路立體化", "行人地獄")

5 keywords_Economy<- c("智慧城市", "製造業", "產業", "物流", "金融", "科技", "引擎", "醫材", "工業4.0", "數位升級", "智慧升級", "創業", "數位新科技", "在地工作", "產業帶", "轉型", "新創轉型", "都心發展", "機能區", "藍色經濟圈", "海洋經濟", "海空雙港", "低碳產業", "產業高值化", "觀光", "旅客", "旅行社", "商圈", "招商引資", "拼經濟", "產業園區", "中科2.0", "新苗計劃", "創業孵化器", "航空城", "產學訓用", "青創基地", "高科技產業", "優質就業", "國際廠商", "高階製造中心")

6.4 Appendix D: Keywords used for comparison of sub-topics relating to fertility

SN	Category
1	keywords_Workplace <- ("安胎假 陪產假 產檢假 育嬰留職停薪 生理假 企業托育 聯合托育 企業哺乳室")
2	keywords_Financial Aid <- ("生育獎勵 嬰兒補助 育兒津貼 育兒補助 生養津貼 生養補助 生育津貼 生育補助 育嬰留職停薪津貼 就學補助 就寫津貼 幼兒學前特別扣除額 免學費 育嬰留職停薪津貼 未來教育及發展帳戶")
3	keywords_Childcare <- ("公托 公幼 托育 收托 送托 托嬰 夜托 臨托 教保服務 教保人員 社區保母 在 校安親班 準公共機制 平價就學場域 平價名額 兒童預防保健服務0-未滿 7 歲 收出養媒合 養安置 兒童三級預防措施 防治兒虐事件")
4	keywords_Infertility <- (懷孕以及孕婦相關 不孕症 試管嬰兒 不孕夫 凍卵 坐月子 產檢 孕產婦關懷中心 產前健康檢查)

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