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**How may definitions of national identity by different political
camps relate to their attitudes towards asylum seekers?
Using XGBoost to analyse newspaper articles in Hong Kong
in 2019**

THESIS

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RESUME / ABSTRACT

Asylum seekers (or formally non-refoulement claimants) have started to draw attention in Hong Kong's public debate since early 2016 after a senior official from the Immigration Department claimed that the city's mechanism of screening asylum seekers was being abused. Not unseen in other places, this group of vulnerable population has then started to be portrayed by some media outlets pejoratively, such as being questioned for the genuineness of their non-refoulement applications as "fake refugees". When Hong Kong embroiled into one of its largest conflict between pro-democracy protesters and the HKSAR Government in 2019 and both the pro-Beijing and opposition camps manifested their respective political ideology saliently, how might the depiction of non-refoulement claimants vary according to a media outlet's affiliated political camp which has its own conception of Hong Kong's national identity?

This thesis aims to investigate this question by using machine-learning-based sentiment analysis on news articles reporting on non-refoulement claimants published in 2019 by printed newspapers in Hong Kong. It is found that, in general, pro-Beijing media outlets were more likely to portray non-refoulement claimants negatively than outlets with other political stances.

With the promulgation of the National Security Law in mid-2020 and the recent closures of several pro-democracy newspaper outlets, one can expect that the narrative on asylum seekers in Hong Kong will be further dominated by pro-Beijing media outlets, thereby potentially fostering a more hostile social environment against those who seek refuge in Hong Kong due to facing threats of tortures in their home countries.

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Preface

My motivation to write on the topic of media portrayal of asylum seekers (or more formally, non-refoulement claimants) in Hong Kong mainly comes from two sources. On one hand, the salient political affiliation of media outlets in Hong Kong as recorded by Lee (2018) has greatly affected how various socio-political issues are framed in the public debate, especially during the 2019 anti-extradition law protest which mobilised millions of Hong Kong citizens to first oppose a law that would have allowed fugitives to be extradited to mainland China and then fight for democracy in the city's political system. As much as these high-profile issues directly relating to the political authority and control over the city by the Beijing Government undoubtedly mark the distinction between pro-Beijing and non-pro-Beijing media outlets in terms of reportage, I suspect that the difference in the narratives by the media outlets in Hong Kong about non-refoulement claimants can also be demarcated based on whether a media outlet is affiliated with the pro-Beijing camp or not.

Indeed, the Hong Kong Government adopts an unwelcoming stance towards foreigners who wish to seek asylum within the city's territory. Apart from completely rejecting the possibility of any refugees being recognised and resettled locally (Immigration Department 2021b), the Hong Kong Government also becomes more suspicious about the genuineness of non-refoulement claims in recent years as the former Chief Executive *CY Leung* once suggested that Hong Kong leave the UN Convention against Torture (UNCAT) in 2016 to alleviate the so-called "fake refugee" problem (Cheng 2016b). Therefore, pro-Beijing media outlets may echo the Government's unwelcoming stance towards non-refoulement claimants in their reportage to sway the public opinion in favour of more stringent measures, whereas pro-democracy outlets may offer counter-narrative which are more sympathetic towards this group of vulnerable population.

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The increasing political pressure faced by alternative media in Hong Kong and, by the beginning of 2022, the closures of several prominent pro-democracy media outlets which had served to be a crucial alternative source of information about socio-political issues for the public besides foreign news media, further increases the rationale for studying whether the narratives on non-refoulement claimants between pro-Beijing and non-pro-Beijing media outlets may differ in terms of attitudes. This is because if political affiliation does turn out to be an influential factor of predicting the sentiment of news articles about asylum seekers in Hong Kong and pro-Beijing camp newspapers are indeed more negative in their coverage about non-refoulement claimants, then it is likely that the media's narrative on asylum seekers in the city will be increasingly dominated by pro-Beijing media outlets following the dissolution of pro-democracy media outlets. This may then foster a higher degree of hostility against non-refoulement claimants on top of the Hong Kong Government's already unwelcoming asylum seeking policies.

Apart from my research interest in the politics behind the media landscape of Hong Kong, I also took this opportunity to test whether automated approaches can help effectively learn the relationship between a media outlet's political affiliation plus other features derived from the news articles and their sentiments towards asylum seekers. As van Atteveldt et al. (2021) note, automated sentiment analysis for non-English language sources appears to be rarely used and yet, despite some caveats, this method can potentially cope with problems of scaling research on larger dataset faced by manual coding. Given the prominence of text as a major medium of transmitting information to readers in newspapers and the availability of tools and software specifically designed for natural language processing in Chinese, studying whether political affiliations of newspaper outlets may be correlated to the attitudes of the news articles on non-refoulement claimants via machine-learning-based sentiment analysis can help explore whether such automated approaches can also generate reasonable insights from Chinese language text data for social sciences research. If machine learning models perform adequately in learning about the relationships between different features (some of which are created from the text in the articles) and the sentiment of the news articles in this analysis, then this may imply that future social sciences research on textual data (e.g. sentiment analysis) in Chinese language can also benefit from using automated methods to scale on larger datasets, given that nowadays a huge amount of

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information in textual format is generated each day which will may pose difficulties for manually going through all the entries if the size of a document corpus is sufficiently large.

The process of the research for this thesis was quite long and not without difficulties. First of all, given the vast volume of literature related to the study of asylum seekers based on numerous perspectives and levels of analysis, it was quite easy to get lost while reviewing the literature. In the end, I decided to focus on the literature of how the definition of national identity may affect the perceptions towards immigrants (of which asylum seekers are a subgroup) because of the remarkable ethnic difference between most of the ethnic-Chinese citizens in Hong Kong and non-refoulement claimants. Besides, the political division in Hong Kong is arguably more salient on how the national identity of citizens in Hong Kong should be defined (e.g. whether ethnic Chineseness or civic values should play a larger role in the definition) even though it is equally valid to classify the political parties within each camp according to the more conventional left-right socio-economic dimension (Ma 2012).

The data collection and pre-processing part also took a considerable amount of time. Apart from selecting relevant news articles about non-refoulement claimants published by newspapers in 2019, the unstructured nature of text data also required a lot of steps to transform them into a suitable format for being machine learning model inputs. Moreover, the fact that the downloaded news articles from *Wiseneews* database do not come with pre-labelled sentiments also means that it is important to refer to reliable coding scheme to operationalise the dependent variable of this thesis (fortunately, the literature is always here to help). As much as there are numerous performant machine learning models available nowadays, the results will not be very meaningful if the data quality is not optimal. Modelling the data, on the other hand, was a relatively less difficult process than the data pre-processing part.

In any case, this thesis was finally written. This also marks the end of my master's programme at the Graduate Institute. Overall, this was quite an enriching experience. I can't simply describe with words how much I have learnt over the last two years. I believe this experience will be invaluable for my life.

Chapter 1

Introduction

Asylum seekers, defined by Amnesty International (2022) as individuals who are forced to flee from their home countries due to threats of persecutions and human rights violations, has become one of the most salient socio-political issues in the 21st Century, especially after the 2015 European Refugee Crisis which has led to numerous political consequences, notably the rise of anti-immigration parties in several European countries. Just as the European Refugee Crisis started to unfold in 2015, the issue of asylum seekers (or more formally, non-refoulement claimants) had not gain significant attention in Hong Kong until early 2016, after a senior Immigration Department official claimed that the city's Unified Screening Mechanism (USM) used for assessing non-refoulement applications was being abused during a TV interview and two fabricated WhatsApp audios alleging asylum seekers of committing robberies and homicides in the New Territories were circulated in society (Ng, Choi, et al. 2019). Not unseen in other countries, non-refoulement claimants are often depicted with pejorative terms which question the genuineness of their applications to seek refuge in Hong Kong from threats of tortures back in their home countries. For instance, during the months when non-refoulement claimants first attracted attention in public debate, a large proportion of headline articles in newspaper were published by two pro-Government (or pro-Beijing) newspapers which portrayed this group of population with various derogatory terms, such as being “fake refugees” who exploit the city's USM to seek illegal work or commit crimes (Ng, Choi, et al. 2019).

The broader political context of Hong Kong as a destination of asylum seekers is that since the transferral of sovereignty from Britain to China in 1997, the city has witnessed increasing tension with its new sovereign owner. Until July 2020 when the *Hong Kong Special Administrative Region*

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(HKSAR) Government passed the National Security Law and the subsequent commencement of the large-scale suppression of the opposition camp such as the mass arrest of 53 pro-democracy activists in January 2021 (BBC 2021), protests against the authority of the HKSAR and Beijing Governments had often occurred. Apart from the annual July 1 protest since 2003, the two most prominent political movements were the 2014 Umbrella Movement and the more recent 2019 anti-extradition law protest which created considerable attention from other countries as well. In the latter protest, what started from several marches in June that altogether mobilised millions of Hongkongers to protests against a law which would have allowed fugitives in Hong Kong for being extradited to mainland China eventually evolved into months-long protests including several violent clashes between protesters and the Hong Kong police. Indeed, the political identities of both pro-Government and opposition camps manifested saliently and confronted each other during the 2019 protest. Perhaps one of the most high-profile events of the confrontation between the two camps' identities would be some protesters forcing their way into the central chamber of the city's legislature building while vandalising the HKSAR emblem and raising the former British colonial flag on the very day which was the 22nd anniversary of Hong Kong's sovereignty being transferred to China (BBC 2019). The question that this thesis will investigate with regard to these two events is:

Given the salient difference of how Hong Kong's national identity is defined by different political camps, the highly politicised nature of Hong Kong's mass media landscape as recorded by Lee (2018) and the prominent role of the Chinese-language mass media in framing socio-political issues, is the sentiment of news articles towards asylum seekers in Hong Kong correlated with the political affiliation of newspaper outlets?

The data to be used for investigating this question will be Chinese-language newspaper articles published in 2019 on non-refoulement claimants. The reasons for focusing on news articles from 2019 are twofold. Firstly, I would like to investigate if the publication pattern (e.g., the dominant publishing outlet on this issue and the distribution of the sentiments of the articles) of news related to asylum seekers in Hong Kong in 2019 shared any similarities compared to when the issue first became salient back in 2016. Secondly, since 2019 was marked with one of the most

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intense conflicts between the Government and oppositions in post-1997 Hong Kong, it would also be interesting to see if there exists pronounced difference in how non-refoulement claimants may be portrayed by media outlets from different political camps, just as how the pro-Beijing (mainly via the Hong Kong police) and opposition camps confronted each other on the streets.

1.1 Contribution to the literature

Besides the motivation to write on this topic as mentioned in the *preface*, this thesis also aims to make the following contributions to the literature. Starting with the literature on asylum seekers in Hong Kong, although there certainly exist numerous studies on non-refoulement claimants with various perspectives such as an anthropological approach to study their life in the city (Vecchio 2014), how asylum seekers may be served for the identity construction of some local youngsters (Mathews 2018) and how Hong Kong's policy and legal apparatus marginalise this group of vulnerable population (Ng 2020), to date there are only few studies directly related to how asylum seekers are portrayed by mass media shortly before and after the issue first drew public attention in 2016 which was an election year of the city's legislature (Ng, Choi, et al. 2019; Ng, Choi, et al. 2021). While these two studies (one on traditional and another on online news media) offer invaluable inspiration to this thesis and are important precursors for the study on this topic, it would be beneficial to also study how news articles about asylum seekers are covered some time after the issue first gained public attention to see if the publication pattern remains consistent or not. This can help better understand if media outlets from certain political camps were likely just galvanising the issue of non-refoulement claimants for electoral gains of their camp in the short run, or they are also attempting to construct a particular framing and narrative on asylum seekers within the city which may then be used to justify policy-making positions in the long run.

This thesis also aims to contribute to the literature on the effects of different definitions of national identity on the perception of immigrants. Specifically, I am interested in whether definitions of national identities proposed by different political camps which vary their emphases on the ethnic-based or civic-based dimensions (the definitions of these dimensions will be elaborated in the *Literature Review* chapter) may lead to different attitudes towards asylum seekers as reflected by the media discourse produced by each camp. It is certainly true that Hong Kong has

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its own particularities which may not be applicable in other cases (for example, Hong Kong has never been a signatory of the 1951 Refugee Convention and thus is not legally bound to recognise refugees), but on a more abstract level, the definitions of Hong Kong's national identity by different political camps can be categorised according to the ethnic and civic dimensions (as discussed in next chapter), and the tension between the opposition in Hong Kong and the central government in Beijing is not completely unseen in other parts of the world where regional authorities have attempted to fight for more autonomy or even independence from the central governments (to name just a few cases, Quebec in Canada and Catalonia in Spain). Accordingly, studying the case of Hong Kong about whether a political camp's definition of national identity may be correlated to its attitude towards asylum seekers can provide indications of how national identity may play a role in affecting the attitudes towards asylum seekers in general and how the politics of asylum seeking regime may develop in regions where the degree of the central government's authority is contested in particular.

Lastly, this thesis aims to test if automated approaches to perform sentiment analysis on textual data in Chinese language can generate reliable results. van Atteveldt et al. (2021) note the lack of endeavours to utilise automated methods on non-English texts for sentiment analysis tasks which hampers the development of comparative research in the communication field, and yet automated sentiment analysis has the benefit of being easier to scale to larger datasets where human coding would become too time- and resource-consuming despite its high degree of validity. Although the two studies by Ng, Choi, et al. (2019) and Ng, Choi, et al. (2021) which used human coding to analyse the narrative on asylum seekers in Hong Kong by mass media between mid-2015 and mid-2016 can more thoroughly examine how non-refoulement claimants are depicted besides knowing the sentiments of the articles, this approach may gradually become very laboursome if a study was to compare the reportage of asylum seekers between newspaper outlets over the span of several years which will considerably increase the size of the document corpus. Accordingly, using the news articles from 2019 to analyse whether attitudes towards non-refoulement claimants may vary according to a newspaper's political affiliation via automated approaches can test the validity of these techniques, thereby checking whether machine-learning-based sentiment analysis is appropriate to be adopted on scaling the analysis to larger document corpora about how socio-political issues may be portrayed in Hong Kong as conditioned by certain features of the news

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articles or media outlets. If the results generated in this thesis via machine learning models are overall reliable, it will be worthwhile to test how such techniques may also fare in other types of policy documents such as speeches made by officials and legislators in the legislature in future research. In short, the validation of machine-learning-based methods in the context of social sciences research for Chinese text data can open up more possibilities for investigating intriguing questions.

1.2 Outline

This thesis will proceed as follow. In section 2, I will review the literature on the theories about how the perception of national identity might affect attitudes towards immigration, how each major political camp in Hong Kong perceives the national identity of Hong Kong, and how each camp perceives asylum seekers. Section 3 explains how the hypothesis is formulated and its expected direction, how the data was collected and pre-processed, what kind of models will be used for the analysis and how the variables will be operationalised. Section 4 records the process of the data analysis from preliminary exploring the data to modelling them, presents the results and discusses the findings. Section 5 concludes this thesis and mentions the potential implications of the findings. To briefly summarise the findings, it is predicted that newspaper outlets from the pro-Beijing camp, which emphasises on the ethnic Chineseness shared among local Hong Kong citizens and mainland Chinese for constructing the national identity of Hong Kong, are indeed more likely to portray asylum seekers negatively than non-pro-Beijing newspapers after accounting for the presence of different topics and other features of the news articles.

Before moving on, it should be mentioned that I will use the terms “asylum seekers”, “refugees” and “non-refoulement claimants” interchangeably. It is true that difference exists between the definitions of asylum seekers and refugees¹. Nevertheless, since the above three terms are generally used to refer to the same group of population in Hong Kong who flee from their own countries to escape from threats of torture, treating these terms as synonyms in this context should better cover how this group of population is portrayed by media outlets in different political camps. In

¹Of course, Dr Cheng’s speech might not necessarily represent the view on asylum seekers by the *whole* localist camp, given localism is an umbrella term encompassing rather heterogeneous political organisations and discourse about Hong Kong’s sovereign status as mentioned before. Nevertheless, his stance on asylum seekers could at least be interpreted as one of the possible ways that localists may view the issue.

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fact, scholars researching on this issue often use the terms I listed without strictly differentiating them (e.g. Vecchio (2014), Ng, Choi, et al. (2019)).

Chapter 2

Literature Review

To understand how the different conceptions of the Hong Kong identity may affect attitude towards asylum seekers, it is important to first review the literature on how national identity may affect attitudes towards immigrants and how Chineseness may be articulated on theoretical level, as well as how political camps in Hong Kong may define the city's national identity and the situation of asylum seekers on empirical level.

2.1 Theories

2.1.1 What is national identity?

I will adopt the definition of national identity proposed by Greenfeld and Eastwood (2007) as how an individual relates to a broader societal order called the nation which is central to modern political and social organisations. Lewin-Epstein and Levanon (2005) point out modern nationalism's conception that people with similar cultures (e.g. language, myths, historic territory) should congregate together as the basis of political community called the nation-state. A closely related but not identical concept to nationalism is ethnicity, defined by Varshney (2007) as sense of belonging shared by a group in ancestry, language, history, culture and/or history. Whereas nations have their own territory-based political authority, this is not necessarily the case for ethnic groups.

Greenfeld and Eastwood (2007) also elaborate on some peculiar features of nationalism. For instance, the secular world where nations are located is deemed the most important to human beings and their life. But the more well-known characteristic is that the world is perceived to be divided into distinct communities (i.e. nations) occupying their own territories, and each member of "the people" within a nation is treated as equal to one another. It is also "the people" who

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ultimately control political legitimacy and authority. These features together contribute to two fundamental implications. Socially, the fact that nationals are considered as being equal and that status is achieved instead of ascribed promotes social mobility. Politically, nationalism has made modern (nation-)states “impersonal” (p.261) because whoever holds the government office does not affect the nation-state’s existence and legitimacy which ultimately rest in popular sovereignty (Greenfeld and Eastwood 2007). But for cultures that had been existing long before nationalism’s entry into these societies, the constructions of novel national identities may often rebrand pre-existing cultures despite the latter’s internal heterogeneity, of which Chineseness is an example which I will look into later.

Lastly, Greenfeld and Eastwood (2007) propose a typology of nationalism with two criteria. The first one is how the nation-state relates itself to its members, from the individualist end of treating a nation as merely a massive group of individuals to the collectivist end of which individuals are subservient to the nation. The other criterion is the well-known “ethnic” versus “civic” dimension which is extensively studied, including its relation with the perception towards immigrants which I will discuss later. In general, ethnic nationalism defines a nation’s members based on ascriptive and rather objective standards such as descent, language and customs which are largely decided at birth, whereas civic nationalism focuses less on the members’ cultural backgrounds than their voluntary allegiance to a political community and its legal institutions within a political territory (Greenfeld and Eastwood 2007; Lecours 2000; Lewin-Epstein and Levanon 2005; Heath and Tilley 2005).

A note on the ethnic-civic dimension is that these two dimensions are not mutually exclusive since Medrano and Koenig (2005) highlight that nationalism in one country can often incorporate both civic and ethnic features, which is quite frequently observed in empirical cases. Accordingly, scholars often create other dimensions of describing nationalism theoretically. For example, Hjern (1998) proposes to additionally gauge whether identifications with ethnic and civic features of nationalism are high (“multiple national identity”) or low (“pluralist”) at the same time (p. 453). Meanwhile, some scholars prefer more fine-grained categories of citizenship criteria. Medrano (2005) breaks the ethnic and civic dimensions further into five categories while describing the importance of criteria for citizenship perceived by the Spanish population, namely (p.137),

- the civic dimension being broken down into:

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- Pure republican criteria: Long-term residence, feeling of belonging, and being a citizen of that state
- Political criteria: Respect for laws and political institutions
- and the ethnic dimension into:
 - Territorial criteria: Place of birth
 - Cultural criteria: Language, religion, customs and traditions and
 - Descent

2.1.2 Impact of conceptions of national identity on attitudes towards immigrants

Perhaps one of the most prominent consequences of how national identity is perceived by individuals is their attitudes towards immigrants. This is because national identity simultaneously defines members and outsiders of a nation (Hjerm 1998; Lewin-Epstein and Levanon 2005; Heath and Tilley 2005). For simplicity's sake, I will mainly focus on how tendency towards defining national identity in ethnic and civic terms may be correlated with perceptions towards immigrants.

To begin with, although it is generally agreed that characteristics used to demarcate membership in a nation can be classified as ethnic- or civic-based on a macro-level, additional categories are often needed to capture the general patterns of how national identity is defined within a country and how such definitions may affect citizen's attitudes towards immigrants. A potential reason for such a need is that although individuals may hold a rather "pure" civic conception of identity mostly devoid of ethnic components, it is quite unlikely that individuals would consider ethnic components as standalone enough for constituting a nation's citizenship without any civic components. Indeed, empirical evidence from Hjerm (1998), Heath and Tilley (2005) and Medrano (2005) demonstrate that it is very rare for individuals to perceive national identity solely in ethnic terms, since those who attribute importance to ethnic-based components are also likely to do so to civic-based ones simultaneously. Often, scholars may even challenge the ethnic-civic-dimension in classifying the perception of national identity and propose alternative schema. Drawing on the Weberian idea of social closure which measures the number of obstacles imposed by a group for outsiders to join, Medrano (2005) proposes the "postnationalist" versus "credentialist" (p.136)

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dimension which differentiates how restrictive people consider acquiring citizenship to their nation should be. Specifically, postnationalists impose few limits on foreigners to become citizens, whereas credentialists require a long list of criteria being fulfilled. That said, even though there exist multiple and equally valid alternatives for categorising how national identity may be defined, the ethnic-vs-civic dimension is quite broadly applicable to explain the typologies of nationalism in countries with some modifications and thus is a decent starting point.

As for the potential impact of national identity on attitudes towards immigrants, the literature tends to agree that the more an individual holds ethnic-based criteria of membership in a nation, the more likely (s)he will be averse against immigrants (i.e. xenophobic). It seems that the effect of ethnic-based national identity conception on xenophobic attitudes is consistent across different immigration policy regimes differing on the ease of naturalisation and the mode of integration. Hjerm (1998) discovers that despite Germany, Australia and Sweden having considerably different immigration policy regimes, individuals who agree that having both ethnic and civic characteristics are crucial for being a member of their nations are more likely to be xenophobic than others who only use civic components to demarcate nationhood or ascribe little importance to nationalism. Similar findings are observed by Heath and Tilley (2005) in the UK context, as British who place more emphasis on ethnic-based nationhood criteria will be more inclined to approve reducing immigrants inflows and more stringent measures against illegal immigrants. Interestingly, Heath and Tilley (2005) also discovers that after controlling for how national identity is conceived, the extent to which an individual is attached to the nation is no longer significant in affecting his/her attitude towards immigrants.

In some cases, however, the effect of national identity on perceptions towards immigrants may be less due to whether individuals hold ethnic-based definitions of national identity than how many criteria individuals deem to be indispensable for obtaining a nationality. For instance, Medrano (2005) argues that even though there is an association between including ethnic-based (or in his terminology “ethno-biological republican”) (p.148) criteria for obtaining Spanish citizenship and holding negative attitudes towards immigrants, it is ultimately how many criteria a Spanish regards as important for being a Spanish citizen that better predicts attitudes towards immigrants, evidenced by the stronger correlation between these two items found in his study.

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Furthermore, depending on the ethnic composition of a nation-state, not only may different ethnic groups have their own definitions of what constitute to the ethnic and civic components of national identity, but also the relations between perceptions of national identity and attitudes towards immigrants may go into rather unexpected directions. Lewin-Epstein and Levanon (2005) discover that in the Israeli society which can be broadly separated into three ethnic groups (namely, veterans Jews who have lived in Israel for a long time, Olim who are recent Jewish immigrants from the former Soviet Union regions, and ethnic Arabs citizens in Israel), there are only moderate similarities in terms of which components should be included into the ethnic and civic dimensions of national identity, as they disagree on whether the ability to speak Hebrew and whether being born in Israel should be labelled as ethnic or civic components. Moreover, contrary to the expectation in the literature, veteran Jews who consider the Israeli nationality as more ethnic-based are actually *less* averse towards immigrants, possibly because they are likely to perceive immigrants as mostly overseas Jews who share the same ethnicity (Lewin-Epstein and Levanon 2005). Nevertheless, the surprising case of Israel is likely to be more due to its specific socio-political context rather the theoretical pitfalls of how ethnic-based conceptions of national identity may be related to xenophobia per se.

2.1.3 Chineseness in Hong Kong

Given over 90% of the population being ethnically Han Chinese by 2016 (Home Affairs Department 2018) and also large-scale pro-democracy political movements in the 2010s challenging the authority of the HKSAR and Chinese Governments (particularly the 2014 Umbrella Movement and the 2019 Anti-Extradition Law Protest), Chineseness indeed occupies a salient position on the discourse of Hong Kong's national identity. It is then important to understand what Chineseness may mean in Hong Kong, a city under British colonial rule for over a century until 1997.

Although Chineseness is usually connoted with a homogeneous image of a group of people with the same ethnic origin, place of residence or cultural characteristics (e.g. language, customs etc.), Chun (1996) problematises this conception not least because expressions used to describe different aspects of Chineseness actually contains heterogeneity. For example, despite the contemporary use of Han Chinese to denote ethnic homogeneity, people under the historical Han empire were anything but ethnically homogeneous. It was not until the 1911 Revolution then China became a

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nation inhabited by the single ethnic group called *Zhonghua Minzu*, and a homogeneous national culture was accordingly invented and legitimised by the state. The efforts to articulate a Chinese national identity continued after the foundation of the People's Republic of China (PRC) in 1949, as both the Kuomintang (KMT) regime in Taiwan and the PRC (after the Maoist period) extensively used Chinese history, political ideology and/or values to construct their national cultures and identities to proclaim themselves being the orthodox Chinese nation.

Whereas Chineseness was constructed by Chinese regimes holding political authority in Taiwan and mainland China, Chineseness manifested quite differently in Hong Kong where it was a Chinese society ruled by the British Government before 1997. According to Chun (1996), most inhabitants in Hong Kong had identified as Chinese until the establishment of the PRC in 1949. So (2015) also mentions that before 1949, ethnic Chinese in Hong Kong did not intend to permanently reside in the city and instead identified with the broader Chinese nation, evidenced by their participation in the anti-colonial Hong Kong-Canton general strikes in the 1920s. When the Chinese Communist Party (CCP) took power in 1949, however, the identity of ethnic Chinese in Hong Kong started to gradually depart from that on the mainland. As Hong Kong had become the venue to the KMT and the CCP's contest of the Chinese identity in the 1950s, the British Government attempted to pull Hong Kong away from this nationalist conflict by actively promoting economic transformation from a Chinese entrepot to exported-oriented economy, and the colonial government started to create a new Hong Kong identity to further distance the citizens from Chinese nationalism following the outbreak of leftist riots in the late 1960s (Chun 1996; So 2015).

With intellectuals in Hong Kong paying more and more attention to local instead of Chinese affairs and the huge influx of illegal immigrants from China in the 1970s, the conflict between the old and newly arrived residents eventually led to the rise of a Hongkonger identity (So 2015). By mid-1980s, Hong Kong developed its own culture which was indifferent to politics while also fusing habits from Chinese and Western cultures together (Chun 1996). As the transfer of the city's sovereignty approached in the 1980s, however, the Hong Kong identity became more complicated. On one hand, the investment opportunities in and relocation of factories to mainland China due to the reform and opening up policy helped rejuvenate Chinese nationalism among Hong Kong business elites and working class who married mainland Chinese (So 2015). Meanwhile, the

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uncertainty associated with the transition of sovereignty, especially after the Tiananmen Massacre in 1989, caused the public to be more conscious of values respected in Hong Kong such as the rule of law and civil liberties and thus increased their perceived difference between Hong Kong and China (So 2015; Fong 2017b; Lin and Jackson 2021).

Amidst the fear of Hong Kong losing its uniqueness after the handover to China in the 1990s, the *One Country, Two Systems* (OCTS) framework which is claimed to keep Hong Kong's autonomy and continuity of the capitalist system for 50 years was accordingly put in place to secure confidence of the public regarding the handover (So 2015; Fong 2017b). Indeed, the first decade after 1997, So (2015) and Fong (2017b) report that overall more and more Hongkongers identified as Chinese despite Beijing's increasing intervention (more on this later) after the mass protest against the legislation of the Article 23 in 2003, and such sentiment peaked in 2008 when China was the host of that year's Olympic Games. But the Hong Kong identity has once again become prominent since 2009 as Hongkongers become aware of Beijing's increasing political interference and the social disruption brought by the large influx of mainland Chinese, and Fong (2017b) highlights how the Hong Kong identity has emerged in a mentality of resisting against "invaders" from the mainland during the period (p.19).

In short, Chineseness, defined as how closely Hong Kong people identify themselves with the Chinese nation, have evolved throughout the course of history, and one could argue that following the handover of Hong Kong's sovereignty to China in 1997, the Chineseness of Hong Kong identity has become more and more contested. This phenomenon is best reflected by how each prominent political camp in Hong Kong envisions the Hong Kong identity.

2.2 Empiric

2.2.1 National identity of Hong Kong defined by different political camps

With Hong Kong's major political cleavage being demarcated by the city's relations with Beijing and the pace of democratisation, different political camps may adopt their own vision of what Hong Kong's national identity should be. Indeed, Lecours (2000) highlights the importance of political goals in affecting how political actors with different ideologies on a region's relations with the national government may formulate national identity through the case study of Quebec.

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He argues that the secessionist Parti Quebecois (PQ) is motivated to adopt an ethnic-based nationalism which emphasises on the French language being the Quebecois' mother tongue because the party needs a more salient cultural marker to convince Quebecois that they are indeed qualitatively different from the Anglophone Canada and thus deserve a separate nation. By contrast, since the autonomist Parti Liberal du Quebec's (PLQ) goal is to demand more political autonomy instead of secession, the party can adopt more civic-based framing of nationalism which does not restrict membership to the Quebecois society exclusively to Francophones, and thus explicit ethnic markers to distinguish between Quebecois and Canadians are not warranted for the PLQ.

In the following paragraphs, I will discuss the political goals of the three prominent political camps in Hong Kong regarding the city's political regime and relations with the Beijing Government, namely, the pro-Beijing camp, the pro-Democracy camp and the newly arising localist camp in the 2010s, and how their political goals may be related to their articulation of Hong Kong's national identity.

The pro-Beijing camp

As the politically conservative force governing Hong Kong, the pro-Beijing camp's objective can be summarised as legitimising China's sovereignty over the city and protecting the political interests of China. Members of the camp include the HKSAR Government itself, political parties and societal actors who lean towards the Beijing Government. Perhaps the most prominent manoeuvre by the pro-Beijing camp to achieve the above objective is counteracting against demands for more rapid democratisation in both the executive and legislative branches to prevent the opposition from gaining control over the political institutions (Ma 2012).

Apart from controlling high-level political institutions in the HKSAR, the pro-Beijing also invests in efforts to foster patriotism towards China in different societal sectors, of which education is one. Bottom up endeavours to instil the Chinese identity into students' minds include organising trips to China as well as pedagogy of pro-China ideologies and Chinese culture by pro-Beijing schools and regular schools which receive sponsorship from the Government or pro-Beijing actors, whereas top-down endeavours from the Government mainly revolves around policies on national education such as teaching Putonghua in primary school since 1998, encouraging schools to raise the Chinese flag and sing the Chinese anthem in significant occasions and the failed attempt

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to make national education itself a mandatory subject which avoids discussion on sensitive issues in 2012 (Lau 2013; Fong 2017b). The pro-Beijing camp also sets up support organisations in communities for electoral mobilisation, as Loh (2010) and Fong (2017b) point out how the largest pro-Beijing parties in Hong Kong have numerous subsidiaries grassroots organisations which can serve to mobilise for votes during elections under the coordination of the Liaison Office (LOCPG), and Fong (2017a) reports an alleged vote-rigging incident in 2015 during which pro-Beijing-affiliated elderly homes were spotted sending elderlies, often of low cognitive abilities, to cast their votes.

With the pro-Beijing camp's goal of securing the ultimate authority and sovereignty of the Beijing Government over the HKSAR, its vision on how the national identity of Hong Kong should be is then closely intertwined with the Chinese identity. In other words, pro-Beijing forces view the Chinese and Hong Kong identities as a whole in which Hong Kong is subordinate to the Chinese nation, and identification with the Chinese nation is translated into support towards the incumbent PRC regime, which self-proclaims as the "vanguard of the Chinese people and the Chinese nation" (Xinhua 2017). Indeed, Lin and Jackson (2021) argue that at least during 2012-19, the HKSAR government primarily portrays the Chineseness of Hong Kong citizens in an essentialist and narrow ethnic-based manner which emphasises on the shared biological inheritance from the ancient Peking Man between Hong Kong citizens and mainland Chinese while downplaying other aspects such as values, cultural heritage and lifestyle. For instance, former Chief Executive CY Leung and pro-Beijing politician Ronny Tong claimed that Hong Kong citizens were obliged to identify themselves as Chinese due to their ascribed biological similarities with mainland Chinese. Ethnic markers were also co-mentioned while HKSAR officials were describing the PRC, as former Chief Secretary Matthew Cheung stated that he was proud as "a son of the Chinese" while witnessing the social and economic progress made by mainland China (Lin and Jackson 2021) (p.914).

This view echoes with that held by the Beijing Government, as Chinese President *Xi Jinping* once claimed that Hong Kong's fate was closely linked to mainland China, and the city was crucial for achieving the Chinese dream (Lin and Jackson 2021). In essence, as the ruling government of post-1997 Hong Kong is now under the sovereignty of the PRC, it is likely that the HKSAR Government and its political ally, the pro-Beijing camp, actively promote Chineseness as an

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ethnic feature that both Hong Kong citizens and mainland Chinese share closely to realign the Hong Kong identity, which is deemed to have developed separately in British Hong Kong (Chun 1996; So 2015), under the umbrella of the Chinese nation so that Beijing could exert more control over the city's ideology. By contrast, civic values are less salient in the official discourse in promoting Chineseness in Hong Kong (except for the value of patriotism which is ultimately another manifestation of the ethnic conception of Chineseness), but are often used by the pro-Democracy camp to portray Hong Kong's distinct (but **not** independent) identity from mainland China.

The pro-Democracy camp (or pan-democrats)

According to Ma (2012), even though several pro-democracy political groups were founded in the 1980s after the commencement of the city's democratisation and elections as well as the signing of the Sino-British Joint Declaration in 1984, it was not until the late 1980s when these groups congregated together for better mobilisation power in large-scale political movements, especially during the 1989 Tiananmen Movement when the Alliance for the Support of the Patriotic and Democratic Movement (ASPDMC) was formed to support students protesting for democracy in Beijing. Shortly afterwards, the first pro-democracy party, *the United Democrats of Hong Kong* (the predecessor of the present Democratic Party) was created in 1990 for next year's first direct election in the legislature (Ma 2012). After the handover in 1997, the pro-democracy camp remains as one of the significant political forces in the HKSAR, including the provision of an alternative perception of the Hong Kong identity vis-a-vis the official rhetoric.

Compared to the pro-Beijing camp which considers protecting the interests of the Chinese nation (currently under the PRC regime) as paramount over other concerns, the pro-democracy camp instead prioritises values such as the rule of law and civil liberties which are regarded to be constitutive to the civic elements of Hong Kong's identity (Kwan 2016). This is evidenced by the pro-democracy camp deeming the Article 23 legislation back in 2003 as contravening personal freedom under the pretext of national security and thus openly opposed to it and organised the 1 July rally against the law's promulgation (Ma 2012). The camp also supported the Occupy Central Movement (a precursor to the 2014 Umbrella Movement) to protest against Beijing's proposal of only allowing pre-approved candidates to run for Chief Executive elections in August

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2014 which is deemed to violate the democratic principles of universal suffrage (Kwan 2016). It can thus be argued that the pro-democracy camp puts more importance on protecting the civic values that they deem crucial for the identity of Hong Kong, even if this means often clashing with the interests of Beijing.

When it comes to identifying which nation Hong Kong belongs to, however, it should be noted that the pro-democracy camp in general still identifies themselves as Chinese, as Kwong (2016) states that especially for the older generation pro-democratic politicians, they are in favour of Hong Kong's sovereignty being transferred from Britain to China in 1997, and they claim to share affinity with China's history, culture and ethnicity despite opposing the CCP's one-party dictatorship. In fact, the identification with the Chinese nation by the pro-democracy camp is well-inscribed in the manifesto of the largest pro-democracy party, *the Democratic Party*, in which the very first article clearly claims that "Hong Kong is an indivisible part of China" (Democratic Party 2021). The pro-democracy camp's identification as members of the Chinese nation may very well explain how they contextualise Hong Kong's democratisation movement and why they do not think the Hong Kong identity is independent of the Chinese one. Kwong (2016) mentions that the pro-democracy camp generally considers Hong Kong's democratisation as integral to that of mainland China, and the annual candlelight vigil by the ASPDMC is a totem of this vision since some organisers perceive a democratic China, if realised, might subsequently bring democracy to Hong Kong as well.

Admittedly, the pro-democracy camp attempted to appeal to localist supporters when the ideology gained huge popularity around the time of the 2016 Legislative Council election, such as calling for the right of self-determination for Hong Kong (Kaeding 2017; Fong 2017b). Nevertheless, this does not mean the pro-democracy camp giving up on caring about political issues in China while relating them to the situation in Hong Kong. Even in the 2021 Tiananmen Massacre candlelight vigil, the ASPDMC stated that Hong Kong people shared "a common fate with those oppressed and deprived of freedom in China", and the organisation would struggle until both Hong Kong and China became democratic (ASPDMC 2021).

In short, the pro-democracy camp considers civic values such as the rule of law and civil liberties as constitutive to the distinctiveness of Hong Kong's identity and is averse towards Beijing's political interventions which often run against these values. Nevertheless, the camp still

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regards Hong Kong as belonging to the same nation with mainland China and is even willing to help their Chinese compatriots in political movements which advocate freedom and democracy. The geographical scope of how wide Hong Kong's political movement of democratisation should concern, then, is partly what makes the localist camp different from the pro-democracy camp even though both favour a democratic regime in Hong Kong.

The localist camp

Broadly speaking, the rise of localism as a third prominent political ideology in the 2010s was due to both the increasing political and socio-economical integration with mainland China as well as the perceived incompetence of the pro-democracy camp to push forward substantive democratisation in Hong Kong. Although the term "localist camp" in reality represents an aggregation of political groups which vary considerably in choosing violent or non-violent means to resist against the Beijing Government, have different views on whether Hong Kong should abandon OCTS and pursue independence, and are much less coordinated in their actions compared to the pro-Beijing and pro-democracy camps, organisations belonging to this camp hold strong aversive sentiment against China **both** in terms of the PRC regime and mainland Chinese who are deemed to be depriving the locals of already scarce public resources and disrupting the city's own way of life, and they all argue the interest of the native Hong Kong citizens should be prioritised over the recent immigrants from mainland China (Kwong 2016). The first substantive discourse to materialise localism as a political ideology was "Hong Kong as a city-state" published in 2011 by scholar *Chin Wan-kan* which, among many other ideas, advocates separating the integration between Hong Kong and mainland China as well as prioritising the needs of Hongkongers (So 2015). The following paragraphs will outline how the rise of localism can be treated as a backlash against both long-existing political camps in Hong Kong while also exploring how localists perceive Hong Kong's national identity.

Starting with the so-called "China factor", the localist camp obviously rejects the pro-Beijing camp's (and the Chinese Government) claim that Hong Kong's identity should be treated as one with that of Chinese. Fong (2017b) illustrates how the China factor has facilitated the rise of localism under the framework of "state-building" versus "peripheral" nationalism (p.2), where Hong Kong is attempting to consolidate its unique identity against Beijing's incorporation of

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the city into the hegemonic national culture. Specifically, after 500,000 Hongkongers had rallied against the Article 23 legislation in 2003, Beijing then started to increase its interventions in multiple areas, such as asserting that its authority overrides the city's autonomy, sponsoring pro-Beijing candidates during elections and fostering further economic integration between Hong Kong and China in finance, tourism and trade (So 2015; Fong 2017b). In turn, the high proportion of respondents in a 2016 survey identifying themselves as Hongkongese amidst the founding of more radical localist organisations which aspire to make Hong Kong a separate nation can be evidence of how the PRC's attempts to assimilate Hong Kong into the hegemonic Chinese identity has risen the consciousness of Hong Kong people about their uniqueness vis-a-vis China and thus foster the increasing popularity of localism (Fong 2017b). Apart from China's foundational discourse on localism as mentioned before, overt advocacy of Hong Kong becoming an independent nation from China is often proposed by some localist organisations, most signified by the establishment of the disbanded *Hong Kong National Party* in 2016 by Andy Chan which aimed to build a "Hong Kong Republic" (Kaeding 2017) (p.165). Some organisations even dare openly insult the PRC to challenge its authority and legitimacy, as two former legislators from the self-determination-advocating *Youngspiration* had taken their office oaths by pronouncing "China" derogatorily in 2016, which caused them to be disqualified from their seats shortly afterwards (Kaeding 2017).

Due to the localist camp's dissociation of Hong Kong with mainland China concerning both Beijing's assimilation and which nation Hong Kong belongs to, they also reject the pro-democracy camp's idea that political development of Hong Kong should be linked to that of China. In effect, the indifference of the localist camp to China's political situation is largely due to the "transition fatigue" which witnesses increasing dissatisfaction with the traditional pro-democracy camp due to the lack of substantive progress in democratisation by 2008 (Kwong 2016) (p.63). The Democratic Party's decision to negotiate with the Beijing Government behind closed doors for a political reform package in May 2010 created profound division within the pro-democracy camp as certain parties believed that more radical measures were needed to fend off Beijing's interference into the city, but the more significant turning point for localism to gain its popularity was the 2014 Umbrella Movement when some youngsters blamed the pro-democracy camp for the Movement's failure in fighting for universal suffrage (Kwong 2016; Kwan 2016).

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The disagreement between the pro-democracy and localist camps thus lies less in what kinds of civic values Hong Kong should uphold (as both camps aim at fighting for democracy and political autonomy of the city) than whether Hong Kong should involve in China's democratisation. Specifically, the pro-democracy camp's insistence on Hong Kong's responsibility to help build democracy in China is met with strong criticism from the localists, who consider that Hong Kong should focus only on its political development since binding Hong Kong's future to a democratic China would hamper the city's own interests (Kwong 2016; Kwan 2016). Thus, the different conceptions of which nation Hong Kong belongs to between the two camps and how much Hong Kong should dissociate from China have caused both camps to have rather contentious relations, as some pan-democrats also consider the localist camp's hostility towards mainland Chinese as xenophobic (Kwong 2016) .

In short, the localist camp does not just treat the Hong Kong identity as ultimately belonging to the Chinese nation despite its distinctiveness like the pro-democracy camp. Instead, Hong Kong is regarded as a separate political entity (or even nation) that should avoid close integration with mainland China in order to protect its own interests. This causes the localist camp to become a third force in Hong Kong's political arena in the 2010s confronting against both the pro-Beijing and pro-Democracy camps.

Before moving onto hypothesising how the three camp's different views on Hong Kong's national identity may impact their views on asylum seekers within the city, table 2.1 summarises how they differ on the vision of the Hong-Kong-China relations.

Table 2.1: Comparison of the three camps on key dimensions of Hong-Kong-China relations

	Pro-Beijing camp China	Pro-Democracy camp China	Localist camp Hong Kong
The nation that Hong Kong belongs to			
Attitude towards political development in China	Political ally of the ruling PRC	Opposes one-party rule of the CCP, sympathetic to Chinese people	Indifference, only focuses on Hong Kong's situation
Prioritised political values	Patriotism and nationalism over individual rights	civil liberties, the rule of law and political autonomy	those of the pro-democracy camp plus prioritising Hong Kong's interests
Means of contention	N/A (as an ally of the Government)	Non-violent	Both violent and non-violent

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Table 2.1: Comparison of the three camps on key dimensions of Hong-Kong-China relations

Degree of within-camp coordination	Strong	Moderate	Weak
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2.2.2 Hong Kong's non-refoulement policy regime

Regarding the legal framework and policies of assessing asylum claims and refugee recognition, the Hong Kong Government has a strong position of not making the city a destination for refugee resettlement. Although Hong Kong is a signatory of the 1992 United Nations Conventions Against Torture (UNCAT) which requires the Government to temporarily house asylum seekers and process torture-related asylum applications, the city has never signed the 1951 Refugee Convention and thus has no legal obligations to permanently resettle refugees within its territory (Ng 2020). This remains true even after the implementation of the Unified Screening Mechanism (USM) in 2014 which made the Government become the sole handler of all the non-refoulement claims, including those which had been previously handled by the UNHCR for refugee status (Ng 2020). Instead, the Government reiterates its lack of intention to determine individuals' refugee status and allow refugees to permanently settle in the city, while also claiming that the recognition and resettlement of refugees should still be referred to the UNHCR "in accordance with its mandate" (Immigration Department 2021b), even though the UN agency states on its website that it would no longer process new refugee and asylum claims following the implementation of the USM (UNHCR 2021). Simply put, the official institutions responsible for assessing asylum applications in Hong Kong have little intention to make the city a destination of permanent resettlement for individuals fleeing from their countries due to threats of prosecutions.

Even if the HKSAR Government is obliged to adjudicate non-refoulement applications as per the UNCAT, the legal and social status of the asylum seekers are quite precarious while awaiting their application results. To begin with, individuals must wait until their visas expire in order to be eligible for non-refoulement applications and then have to report regularly to the Immigration Department (UNHCR 2021), an arrangement that Ng (2020) considers as the Government's attempt to exclude asylum seekers from the rights granted to legal residents in the city (e.g. working) and receiving welfare supports via criminalising asylum seekers as illegal overstayers. Furthermore, the Immigration Department has the final authority to prosecute

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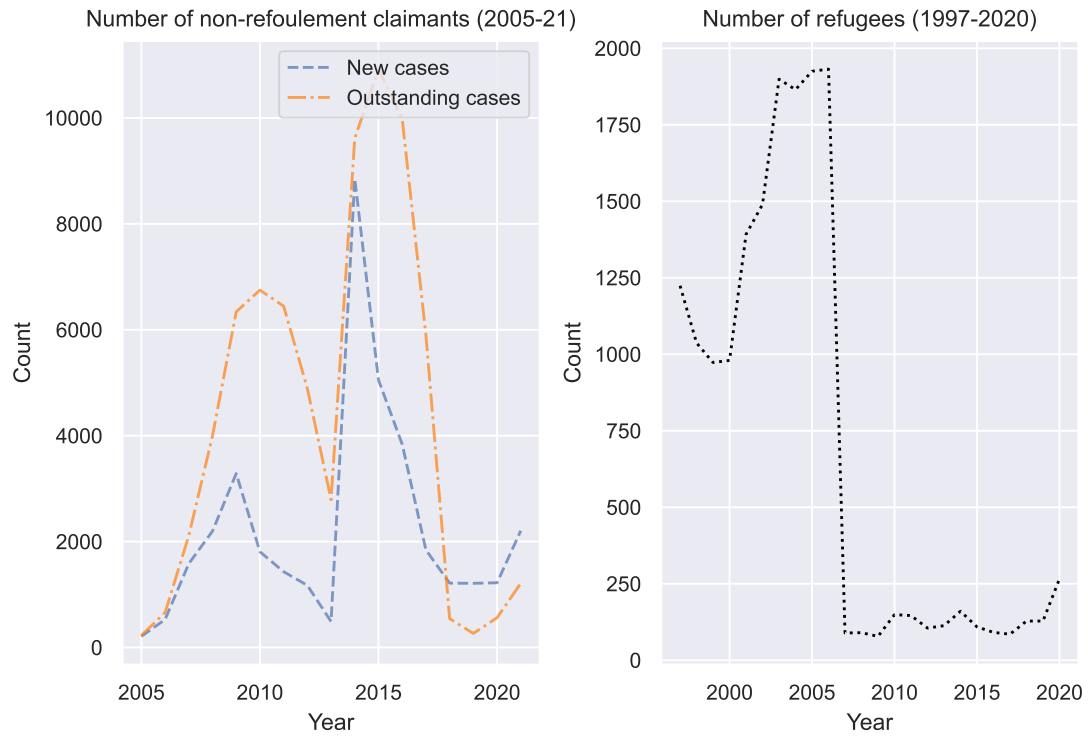


Figure 2.1: Number of non-refoulement claim cases (left) and refugees (right) in Hong Kong

the asylum seekers for having illegally overstayed beyond the validity of their visas, and officials frequently call these populations as *illegal immigrants* (Ng 2020). Coupled with the Government's refusal to recognise and resettle refugees in its territory, the institutional framework of asylum seeking in Hong Kong can thus be described as unwelcoming towards those who are fleeing from persecutions in their countries of origin, since these applicants not only have to first become illegal immigrants for eligibility to request non-refoulement, but also they are under the constant threat of being charged for their immigration status.

The HKSAR Government's unwelcoming stance towards asylum seekers and refugees is likely to be one of the major reasons for the low numbers of non-refoulement claims and refugees in the city since 2005. For instance, the left plot in figure 2.1 (Immigration Department 2021a) shows that the number of *new* non-refoulement claims submitted each year from 2005 to 2021 on average was lower than 4000, and the sudden rise of new applications to around 9000 instances in 2014 was more likely due to the implementation of the USM requiring the Government to also assess claims previously handled by the UNHCR than the commencement of a more liberal asylum-seeking regime. Likewise, the number of *outstanding* non-refoulement cases by year during

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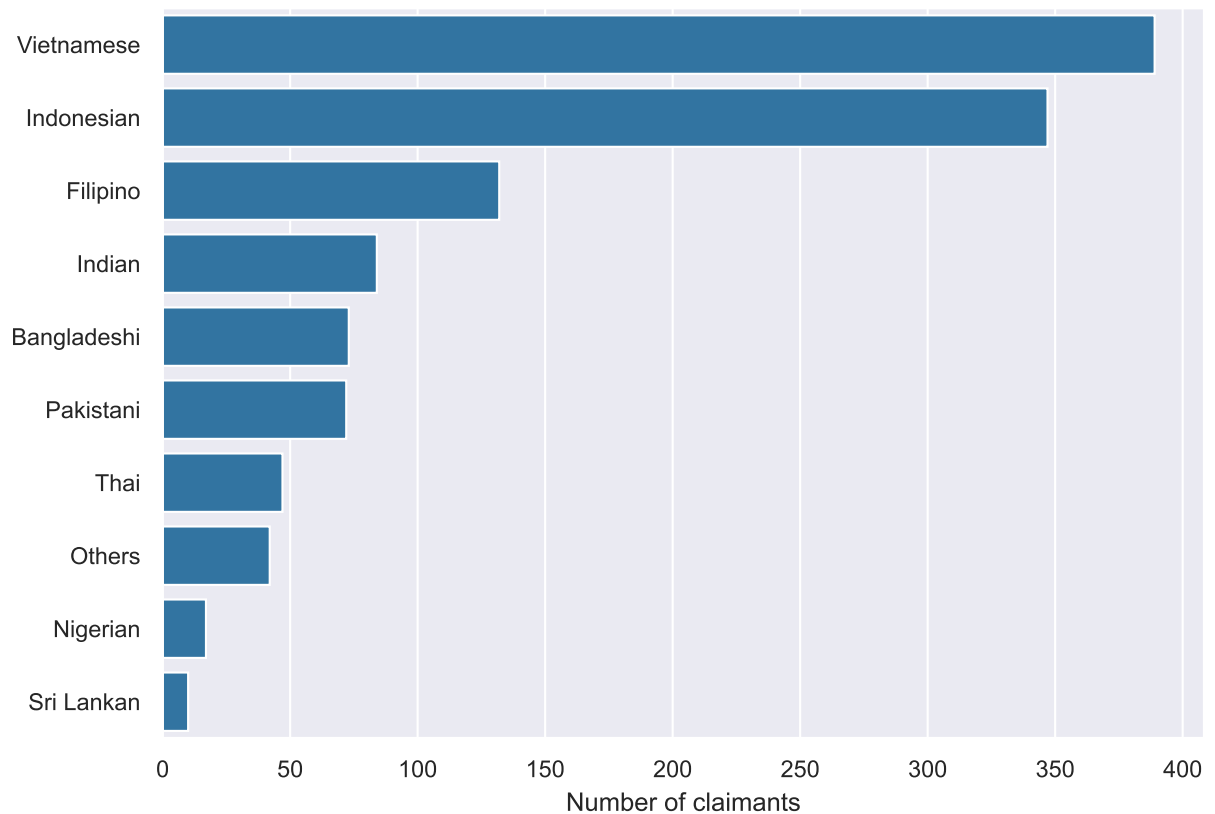


Figure 2.2: Number of non-refoulement claimants by nationality in 2021

the same period generally surpassed that of new cases except from 2018, a few years after the USM had been implemented. By 2018, non-refoulement claimants constituted to a mere 0.2% of Hong Kong's total population of over 7 million, a figure considerably smaller when compared to a total of 3.5 million refugees in Asia as Ng (2020) contrasts. The right plot in figure 2.1 (World Bank 2021) shows how the number of *refugees* in Hong Kong has dramatically reduced to no more than 250 persons each year (save for 2020) since 2007 after the Government had closed the last refugee camp hosting Vietnamese who fled from the Vietnam War in the 1970s (Ng 2020). Lastly, figure 2.2 (Immigration Department 2021a) indicates the nationalities of non-refoulement claimants, who mostly are from South and Southeast Asia, with a few from Africa as well. One particularly interesting insight from this graph is that despite the frequent racial labelling of non-refoulement claimants as South Asians by some media outlets (Ng, Choi, et al. 2019), it is actually **Southeast Asians** who constitute the largest proportion of non-refoulement claimants.

2.2.3 How do different political camps respond to the issue of asylum seekers in Hong Kong?

After laying out the definitions of Hong Kong's national identity by various political camps as well as the policy regime of non-refoulement claims, how can we expect the attitudes towards asylum seekers may vary by political camp in Hong Kong? Do preliminary evidence align with expectations based on the literature on the relationship between the perception of national identity and attitudes towards immigrants?

Theoretical expectations in the case of Hong Kong

Starting with the pro-Beijing camp, because of its emphasis on the Hong Kong identity being a subset of the Chinese nation largely due to the ethnic homogeneity between residents in Hong Kong and on mainland China, I expect that this camp will be the least likely to express a positive attitude towards non-refoulement claimants who, as figure 2.2 shows, are considerably non-ethnic Chinese. This is because as research by Hjerm (1998) and Heath and Tilley (2005) demonstrate, more ethnic-based definitions of national identity are correlated with high degrees of aversion against immigrants, and in the case of the pro-Beijing camp, the significance of the ethnic Chineseness in defining the Hong Kong identity is so primordial that such rhetoric is propagated from pro-Beijing politicians in Hong Kong up to *Xi Jinping* himself as the President of the sovereign state of Hong Kong (Lin and Jackson 2021). One potential mechanisms for the pro-Beijing camp and its affiliated media outlets to be more hostile against non-refoulement claimants may be the conception of the majority ethnic-Chinese population in society as a family mentioned by Erni (2012), which potentially marks the non-refoulement claimants for permanently being strangers of the society due to their ethnic distinctiveness.

By contrast, even though the pro-democracy camp identifies with the Chinese nation, the fact that they also put considerable emphasis on civic values such as the rule of law and civil liberties for the definition of the Hong Kong identity is likely to make this camp at least less hostile towards asylum seekers in Hong Kong. In fact, given this camp's past history of activism related to human rights (most notably the annual candlelight vigil on 4 June to commemorate the 1989 Tiananmen Massacre), they may even be more sympathetic towards non-refoulement claimants who are, by

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definition, forced to seek refuge overseas to escape from human rights violations (i.e. tortures) and demand that the HKSAR Government treat this group of population humanely.

As for the localist camp, although they argue that the interests of native Hong Kong citizens should be prioritised, they are usually referring to how Hong Kong citizens should have access to public resources before mainland Chinese who recently immigrated into Hong Kong. When it comes to ethnic minorities in Hong Kong, the localist camp has not mentioned whether the interests of native ethnic Chinese population should be prioritised. Therefore, it will be difficult to expect a priori with which attitude the localist camp and its associated media outlets may tend to view the issue of asylum seekers.

Empirical observations

Putting aside the lack of a clear expectation of the localist camp's attitude towards non-refoulement claimants, it seems that drawing from preliminary evidence, how the pro-Beijing and pro-democracy camps tend to view asylum seekers in Hong Kong are consistent with the expectations formulated according to the literature. In other words, the pro-Beijing camp in general creates an antagonising narrative against non-refoulement claimants, whereas the pro-democracy camp is more inclined to advocate for better treatment towards this group of vulnerable population.

Starting with the pro-Beijing camp, some politicians echo with the HKSAR Government's restrictive policies of non-refoulement claims by openly questioning the legitimacy of individuals seeking refuge from tortures in Hong Kong. For instance, pro-Beijing legislator Holden Chow submitted a motion in November 2016 under the banner of "combating bogus refugees" who worked illegally and committed crimes while awaiting for the decisions of their applications and called for the revision of the USM as well as the implementation of measures against illegal immigrants adopted by other countries (Yuen 2016). Some pro-Beijing parties also reach out to the public to sway the latter's opinion, such as the Democratic Alliance for the Betterment and Progress of Hong Kong (DAB) setting up a booth in the ethnic-minority-concentrated Tsim Sha Tsui district to hand out pamphlets about measures against "fake refugees" (Cheung and Grundy 2016). Perhaps the most dramatic proposal of dealing with the so-called "fake refugee" issue by the pro-Beijing camp was the former Chief Executive *CY Leung's* suggestion to withdraw from the UNCAT in 2016 so that Hong Kong would not be obliged to assess non-refoulement

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claims anymore (Ng, Choi, et al. 2019). Coupled with the high frequency of pro-Beijing media outlets in pejoratively portraying asylum seekers in Hong Kong as mentioned earlier, the pro-Beijing camp promotes an unwelcoming rhetoric against asylum seekers that is consistent with the Government's refusal to permanently resettle refugees and reluctance to handle asylum seeking claims.

As the pro-Beijing camp advocates more stringent measures against non-refoulement claimants whom they deem as detrimental to the security of Hong Kong, the pro-democracy camp is considerably more sympathetic towards asylum seekers. When Holden Chow's motion was tabled for voting in the legislature in December 2016, it was barely rejected due to the pro-democracy camp's opposition of Chow's motion as "hypocrisy and discrimination in disguise" by indiscriminately applying the proposed "draconian measures" on all asylum seekers (Cheng 2016a). Among all pro-democracy legislators, Dr Fernando Cheung was perhaps the most vocal in fighting for better treatments of asylum seekers in Hong Kong, as he met with non-refoulement claimants directly on several occasions while receiving the latter's approval (Justice Centre Hong Kong 2014; Vision First 2015; Refugee Union 2018). Indeed, legislator Cheung's prominent advocacy for the rights of asylum seekers indirectly caused him to become a victim of political smearing a few months before the 2016 Legislative Council election, as political banners impersonating legislator Cheung's party were seen hanging in streets which maliciously called the legislator "the father of refugees" (Ngo 2016). It should be noted that, nevertheless, a more lenient attitude towards asylum seekers does not mean that the pro-democracy camp totally disregards the perceived issue of bogus refugees. Even though legislator Charles Mok condemned Holden Chow's motion against "bogus" refugees as "disturbing", he also blamed the HKSAR Government for the existence of "bogus non-refoulement claims" due to the Government's lack of efficiency and knowledge in screening out bogus claims which in turn exacerbated the issue (Cheng 2016a). But in general, the pro-democracy camp supports a more humane treatment towards non-refoulement claimants who are genuinely in need of fleeing from their countries due to threats of tortures.

Lastly, anecdotal evidence suggests that the localist camp adopts a less unwelcoming stance towards non-refoulement claimants compared to that adopted towards mainland Chinese. As one of the few localist lawmakers who were not disqualified in the oath-taking controversy by December 2016, Dr Cheng Chung-tai's speech which opposed Holden Chow's anti-fake-refugees

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motion had two points which are worth highlighting¹ (Legislative Council 2016) (p.1232-33). Firstly, he shared the pro-democracy camp's view that the major reason for the problem of "bogus non-refoulement claims" is that the Government has not allocated sufficient resources to efficiently assess the claimants' applications after the commencement of the USM in 2014. But the more intriguing point of view is how he framed Hong Kong's signatory status of the UNCAT as a proof of the city having its own *de-facto* sovereignty from mainland China, and thus he opposed CY Leung's suggestion of withdrawing from the treaty since it would signify Hong Kong's backsliding in civilisation. Interestingly, the localist camp's reservation of adopting more drastic measures against asylum seekers (e.g. quitting the UNCAT) has drawn smear from some pro-Beijing medias, such as an editorial from the Sun (2016) accused the localist camp of "remaining silent" on non-refoulement claimants wasting the public resources of Hong Kong. That being said, it is rather difficult to conclude how the localist camp views the issue of non-refoulement claimants from this single anecdote.

¹Of course, Dr Cheng's speech might not necessarily represent the view on asylum seekers by the *whole* localist camp, given localism is an umbrella term encompassing rather heterogeneous political organisations and discourse about Hong Kong's sovereign status as mentioned before. Nevertheless, his stance on asylum seekers could at least be interpreted as one of the possible ways that localists may view the issue.

Chapter 3

Methods

In the previous chapter, I covered the literature on how perceptions of national identity may affect the attitudes towards immigrants, how political camps in Hong Kong define national identity and their attitude towards the treatment of non-refoulement claimants. With the above theoretical basis of how each political camp is likely to perceive the issue of asylum seekers in Hong Kong, I will now move on to investigate how informative the political affiliation of media outlets is for predicting the sentiments of news articles on non-refoulement claimants after accounting for other factors, such as the content and the metadata of the news articles. This chapter will discuss the research strategies in detail before presenting the analysis results in the next chapter.

3.1 Hypothesis

Following the aforementioned discussion, the pro-Beijing camp expresses more overt hostility towards non-refoulement claimants in Hong Kong than other political camps by frequently referring to the latter as “fake refugees” which warrant solutions derived by the HKSAR Government in order to protect the interests of the Hong Kong society. Therefore, I decided to formulate H_1 as follows:

H_1 : Pro-Beijing media outlets are more likely to negatively portray asylum seekers than media outlets from other political camps.

Should the analysis result demonstrates that the probability of a news article being negative (how the sentiments are operationalised will be discussed later) is higher if it is published by pro-Beijing media outlets, then this hypothesis should be accepted.

3.2 Data collection

The data will be drawn from Chinese language news media reports on asylum seekers in Hong Kong published by local printed newspaper outlets during 2019¹. For the retrieval of the relevant newspaper articles, I will rely on the *WiseNews* database which can fetch news articles with search keywords². While it would have been more ideal to also include online news media into the dataset as Lee (2018) mentions that they have become quite prominent in the 2010s for providing counter-narratives against the mainstream media which are often co-opted by the Chinese Government³, *WiseNews* does not directly provide the texts of online media news article and thus requires additional steps of web scrapping which are, unfortunately, beyond the author's capacity by the time of writing. That being said, including only the printed news media during 2019 would still cover 16 of the well-known news media which were included in the 2019 media credibility survey by CUHK (2020). In other words, just searching for printed news media outlets still allows me to discover whether the attitudes of reporting on asylum seekers by some of the most well-known and widely circulated media outlets in Hong Kong might be related to their political associations.

The reason for choosing to collect media reports published in 2019 is because it was the year when the Anti-Extradition Law Amendment protest first broke out in June and then lasted for several months, a period when one can argue the manifestation of political ideologies and identities should be the most salient for all the political camps. This should indeed be the case for both the pro-democracy camp whose supporters participated in several large-scale protests and sometimes even engaged in violent clashes with the Hong Kong police to oppose a law that would have permitted extradition of fugitives to mainland China, and the pro-Beijing camp whose authority was once again immensely challenged after the 2014 Umbrella Movement. Accordingly, it would be interesting to investigate whether the issue of asylum seekers was still reported in similar manners given the co-occurrence of another arguably more salient political event (i.e. the anti-Extradition Law protests), as compared to when the issue had first become salient back in 2016.

¹The full list of the included newspaper outlets is provided in *table 3.2*.

²I would like to thank my friend in Hong Kong helping me gain access to the database, which would otherwise have been extremely difficult.

³It should be noted, however, that by the very beginning of 2022, several online media outlets such as *Stand News* has dissolved after the flagship pro-Democracy newspaper outlet *Apple Daily* was forced to shut down in June 2021. The implication of this phenomenon to the media's narrative on asylum seekers in Hong Kong will be discussed further in the conclusion chapter.

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It is worth discussing some limitations of using media reports as the source of data. For starters, media reports do not necessarily reflect how individuals identifying with each political camp might perceive asylum seekers directly and might not be fit for investigating the causal mechanism of how definition of Hong Kong's national identity may cause a political camp to frame asylum seekers in particular ways in face of the public. Despite these shortcomings, media reports can still adequately help test the hypothesis of whether narratives on asylum seekers in Hong Kong may vary by political camps which share drastically different definitions of Hong Kong's national identity because media reports will likely reflect each political camp's preferred version of framing on the issue to which they would like to propagate. In fact, previous research about the framing of asylum seekers by mass media (Cooper et al. 2017; McKay et al. 2011; Ng, Choi, et al. 2019; O'Doherty and Lecouteur 2007) point to its potential impact on affecting how the public may perceive the issue via being a major provider of related information, and sometimes media reports may even serve to justify policy-making decisions or reflect the government's position on the issue (when the media simply repeat the information provided by officials). Drawing from Fong (2017a) and Lee (2018), the media industry in Hong Kong is quite remarkable for their political stances, and numerous outlets have their owners being affiliated with the Chinese and/or HKSAR Governments. Therefore, reports published by Hong Kong media outlets should be able to reflect political camps' attitudes towards asylum seekers and, perhaps more importantly, the version of framing that they would like to persuade their readers to accept, thereby making them a suitable data source to gauge how may each political camp's discourse on asylum seekers vary given their contrasting definitions of the city's national identity.

Language-wise, including only Chinese-language news media omits how asylum seekers may be represented by English-language media in Hong Kong (e.g. the South China Morning Post) and thus cannot investigate whether the representation of asylum seekers by English-language media outlets to potential non-Chinese audience may also vary based on each outlet's political affiliation. Moreover, solely focusing on textual content of the media reports means discarding graphical and (if also published online) audio-visual materials accompanied in a given news report, which may contain additional information that are not observed in the texts of news articles. Nevertheless, analysing the textual content of the media reports should still yield a considerable amount of information about the representation of asylum seekers in Hong Kong by media outlets linked

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to different political camps, since after all a large proportion of the content in news reports are represented textually.

To search for relevant media reports on WiseNews, I will refer to the keywords used by Ng, Choi, et al. (2019) which are commonly used for referring to non-refoulement claimants by the media. These terms can either be directly describing this group of population (e.g. refugees, illegal immigrants) or policies related to asylum seeking (e.g. non-refoulement claim, immigration paper). Table 3.1 lists all the Chinese terms used for searching the relevant news articles on WiseNews and their meanings in English. Additional notes are used for indicating whether some articles were omitted and why. The author also omitted articles only mentioning the keywords briefly throughout the main text which discusses issues not directly related to asylum seekers. As for the keywords “South Asian”, “illegal immigration” and “human snake”, the author only included news entries fetched from these keywords if at least one of the other keywords directly referring to asylum seekers (i.e. non-refoulement claim(ant), torture claim(ant), asylum seeking, refugee and immigration paper) co-appeared in either the title or main text. This is to ensure that the news articles in the dataset are obviously describing non-refoulement claimants in Hong Kong.

Table 3.1: Translation of the keywords used to search for media reports on WiseNews

Original terms in Chinese pinyin	Literal meaning in English	Notes
mian3 qian3fan3 sheng1qing3 ku4xing2 sheng1qing3	Non-refoulement claim(ant) Torture claim(ant)	
fei1fa3 ru4jing4, ren2she2	Illegal immigration, human snake (alias of illegal immigrants)	Excluded illegal immigration from mainland China
xun2qiu2 bi4hu4	Asylum seeking	Excluded asylum seekers <i>outside of</i> Hong Kong
nan4min2	Refugee	Excluded refugees <i>outside of</i> Hong Kong and Hong Kong activists seeking refuge overseas
nan2ya4	South Asian	Articles about the South Asian region are excluded.
xing2 jie1 zhi3	Immigration paper	Documents issued by the Immigration Department to non-refoulement claimants.

3.3 Machine-learning-based sentiment analysis

3.3.1 Model selection

While the dataset can certainly be analysed via human coding to qualitatively investigate how the usage of language in reporting on non-refoulement claimants may vary by political camp, due to my motivation of testing the efficacy of machine-learning-based sentiment analysis on non-English-language texts as well as concern on time and resource intensiveness of manually coding over 500 articles in the dataset, I will instead use supervised machine learning models to test H_1 . In other words, H_1 will be treated as a sentiment analysis problem which classifies the *polarity* of the news articles (i.e. whether they reported on asylum seekers *positively*, *neutrally* or *negatively*). How the independent (both the media outlet's political camp and other controls) and dependent variables are operationalised and coded will be discussed in the next section, and for now I will talk about what kinds of tools and models will be used for the analysis. Nevertheless, it is important to remind that even if machine learning methods can potentially improve the scalability of sentiment analysis on larger datasets, there are also caveats listed by van Atteveldt et al. (2021) such as accidentally identifying spurious relationships between variables or overfitting which can hamper the validity of the analysis. Thus, it is important that I keep these issues in mind while modelling the data and adopt remedies to these problems if necessary.

Starting with the models that will be used for the analysis, I will rely on some commonly used classification models. Candidate models thus include logistic regression, support vector machine (SVM), random forest and gradient boosting. Although van Atteveldt et al. (2021) also mention that deep learning is another popular choice of machine learning model for sentiment analysis, I did not use it due to the relatively small size of the dataset at hand as well as the difficulty of interpreting the features' impact on the dependent variable directly from deep learning models. I will first run some baseline models with the default parameter settings of the models before selecting one for hyper-parameter tuning based on their performance on their *f1 scores* (which measures the harmonic mean of *precision* and *recall*) on both the test data set (which will be 20% of observations in the original dataset stratified by the dependent variable) and 5-fold cross validation⁴. Compared to metrics like accuracy and the ROC-AUC score, using f1 score as the

⁴Just a reminder, the formula of calculating a model's F1 score is: $2 \cdot \frac{(\text{precision} \cdot \text{recall})}{(\text{precision} + \text{recall})}$ (Pedregosa et al. 2011).

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evaluation metric can better measure a model's performance if there is class imbalance in the dependent variable.

The reason for relying on the f1 score generated from both the testing set and 5-fold cross validation for model selection is because of the inherently small size of the dataset. In the case of having small datasets, using only the test data for model evaluation may risk over- or under-estimating the performance of the model due to the small number of observations only available in the testing data (Brownlee 2020). On the other hand, only using 5-fold cross validation on the whole dataset for training the model cannot have any indication about how the model may perform on predicting data which are completely unseen beforehand to test for its ability to generalisation. Consequently, I decided to take into account of each model's f1 score in both scenarios for a more comprehensive assessment of their performance. The model which overall performs the best will then be used for calculating the *SHAP values* of the features which evaluate how much impact each feature has on the model prediction when the features is at certain values versus at its baseline value (Lundberg and Lee 2017). In essence, the higher the magnitude of a feature's SHAP value, the larger its impact on the model's prediction. And for classification models, positive SHAP value means that an observation is *more* likely to be predicted for belonging to a certain class in the dependent variable, whereas negative SHAP values mean an observation is *less* likely to be predicted for belonging to a certain class.

3.3.2 Data pre-processing

To pre-process the articles into suitable formats as machine learning model inputs, I will also transform the news articles into a term-document matrix which records the frequency of each word (i.e. token) appearing in each article (i.e. document). Instead of simply counting the frequency of each token in the document corpus, I will use the term-frequency inverse-document-frequency (TF-IDF) matrix transformation which also scales down the importance of tokens that appear in a large proportion of the documents in the corpus since these tokens are likely to be less informative on the content of the documents than tokens that appear in smaller proportions of the documents (Pedregosa et al. 2011). Note that only tokens which appears in all least 2% of the documents in the corpus will be included in the term-document matrix so that I do not include too much noise in the resulting TF-IDF matrix.

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Due to the relatively small size of the dataset (with only around 550 articles), I will also adopt non-negative matrix factorisation (NMF) to reduce the dimensionality of the dataset to prevent overfitting. According to Stevens et al. (2012) (p.953), the matrix denoted as H which captures the weight of each topic (as columns) in each document (as rows) of the corpus can help summarise the information of the articles in terms of which topic(s) they primarily focus on. Thus, I will use NMF to transform the TF-IDF matrix into another matrix which summarises the news articles into a certain number of pre-defined latent topics (the exact number will be figured out at the *Pre-processing* section in next chapter), and then use this matrix as part of the inputs for the models.

There are also some model-specific pre-processing steps (e.g. standardising numerical features so that their means are centred at 0 and are on the same scale) which will need to be performed accordingly. I will detail them out as necessary at the **Sentiment analysis** section in next chapter.

3.3.3 Implementation

The majority of the implementation from data pre-processing, modelling to validation will be done via the `scikit-learn` package in Python (Pedregosa et al. 2011), whereas the tokenisation of the Chinese-language news articles will be done by the `jieba` package which is designed for natural language processing in Chinese (Junyi 2021). For better tokenisation of the articles, I will also remove stop words, punctuations and hyper-links of the texts and add words related to Hong Kong politics (downloaded from elgarteo (2021)) and asylum seekers into the dictionary. As for the gradient boosting model, the `XGBoost` package (Chen et al. 2015) will be used since it is one of the most renowned machine learning models in data science, and it also offers a lot of options for tuning the model for better performance.

3.4 Operationalisation

3.4.1 Main independent variable (a.k.a main feature)

Starting from the main independent variable which classifies the associated political camp of the media outlets, I will mainly refer to the literature exploring how Hong Kong's media industry is intertwined with politics and perform additional research when needed. I consulted the articles

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by Fong (2017a) and Lee (2018) on the development of post-1997 Hong Kong’s media industry, of which they have documented the co-optation of Hong Kong media outlets by the Chinese Government (e.g. the major shareholders holding positions in official institutions such as Chinese People’s Political Consultative Conference). Building on the concept of “allocative control” (p.11) by Lee (2018) about media outlet owners having the ultimate decision on the personnel and resources at the newsroom’s disposal for reporting news which may motivate frontline journalists to engage in self-censorship, I will code media outlets whose owners are affiliated with the official Chinese and/or Hong Kong Government organisations as belonging to the pro-Beijing camp. As for those media owners with less apparent links with the Chinese or Hong Kong Governments, I will decide the classification according to whether the owners are known to be affiliated with a certain political camp and how a given media outlet is perceived for its political stance. Media outlets without apparent political stances are labelled as “neutral”. Table 3.2 is the resulting classification scheme. *Note that due to the medium of publication of localist news media being overwhelmingly online, none of the outlets in that camp was included in the dataset. Therefore, it would not be possible to test whether the sentiment of reportage on non-refoulement claimants in Hong Kong may be related to localist camp affiliation of media outlets.*

Table 3.2: Classification of the associated political camp of media outlets in Hong Kong included into the sample, source: Fong (2017a); Lee (2018); author’s own research

Associated political camp	Media outlets
Pro-Beijing camp (directly owned by the Liaison Office of the Central People’s Government or the HKSAR Government)	Wen Wei Po, Hong Kong Government News, Hong Kong Commercial Daily, Ta Kung Pao
Pro-Beijing Camp (owners affiliated with political institutions on mainland China/ HKSAR Government)	Oriental Daily News, Sing Tao Daily, Sing Pao, Headline Daily, Hong Kong Economic Journal, Hong Kong Economic Times, am730, Sky Post
Pro-Democracy camp	Apple Daily, Kung Kao Po ⁵
Localist camp	N/A
Neutral	Metro Daily, Ming Pao Daily News

⁵The decision to put *Kung Kao Po* under the pro-democracy category is made after using the keyword *anti-extradition* (*fan3xiu1li4*) in Chinese to search for relevant news articles on the newspaper’s *website*, which yielded entries that are overall sympathetic to the protesters and disapprove the HKSAR Government’s handling of the protest.

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Publication of news articles by outlet and political camp

Figure 3.1 shows the number of news articles on non-refoulement claimants published in 2019 by newspaper outlet (left) and political camp (right). Consistent with the study by Ng, Choi, et al. (2019), Oriental Daily News continues to be the media outlet covering the most frequently on asylum seekers with 384 (or 68.94%) articles throughout 2019. By contrast, the second-most frequent publisher *Sing Tao Daily* only had 45 entries (or 8.08%) of the total number of articles published. Each of the other newspaper outlets only constituted to a small portion of news articles about non-refoulement claimants in 2019. Therefore, the issue of asylum seekers in Hong Kong still appeared to be the most salient for Oriental Daily News by 2019, evidenced by its unmatched volume of articles related to this issue vis-a-vis other media outlets.

If we look up the number of news articles on non-refoulement claimants by political camps, the pro-Beijing camp dominated the coverage of asylum seekers in Hong Kong in 2019 largely due to the huge volume of publication by Oriental Daily News. Meanwhile, both neutral and pro-democracy newspaper outlets published similar amounts of articles throughout 2019, and both camps constituted to small proportions of the share of articles during the year. Even if we omitted the sheer volume of articles published by Oriental Daily News, the pro-Beijing media would still have 131 articles published altogether which was still considerably more than the quantity of articles written by neutral and pro-democracy media outlets combined. A question that may arise is that given the comparatively much smaller volume of publication on non-refoulement claimants by neutral and pro-democracy newspaper outlets, is it likely that the articles published by outlets from these two camps will still have potential influence in shaping the narrative on asylum seekers in the broader society? The answer to this question is a rather assuring yes for these two groups of outlets.

Starting with outlets in the pro-democracy camp, *Apple Daily* is one of the most popular paid newspapers in Hong Kong since it occupied over half (54.7%) of the market share in the paid newspaper market and was ranked as the second most popular printed newspaper in Hong Kong by 2019 (Adintime 2021). Apart from being widely circulated in society, Apple Daily was also known for its pronounced pro-democracy stance as it gradually transformed from a pure sensationalist tabloid to flagship newspaper which framed and reported news that were critical of the Beijing and HKSAR Governments since the early 2000s which contributed to its growing

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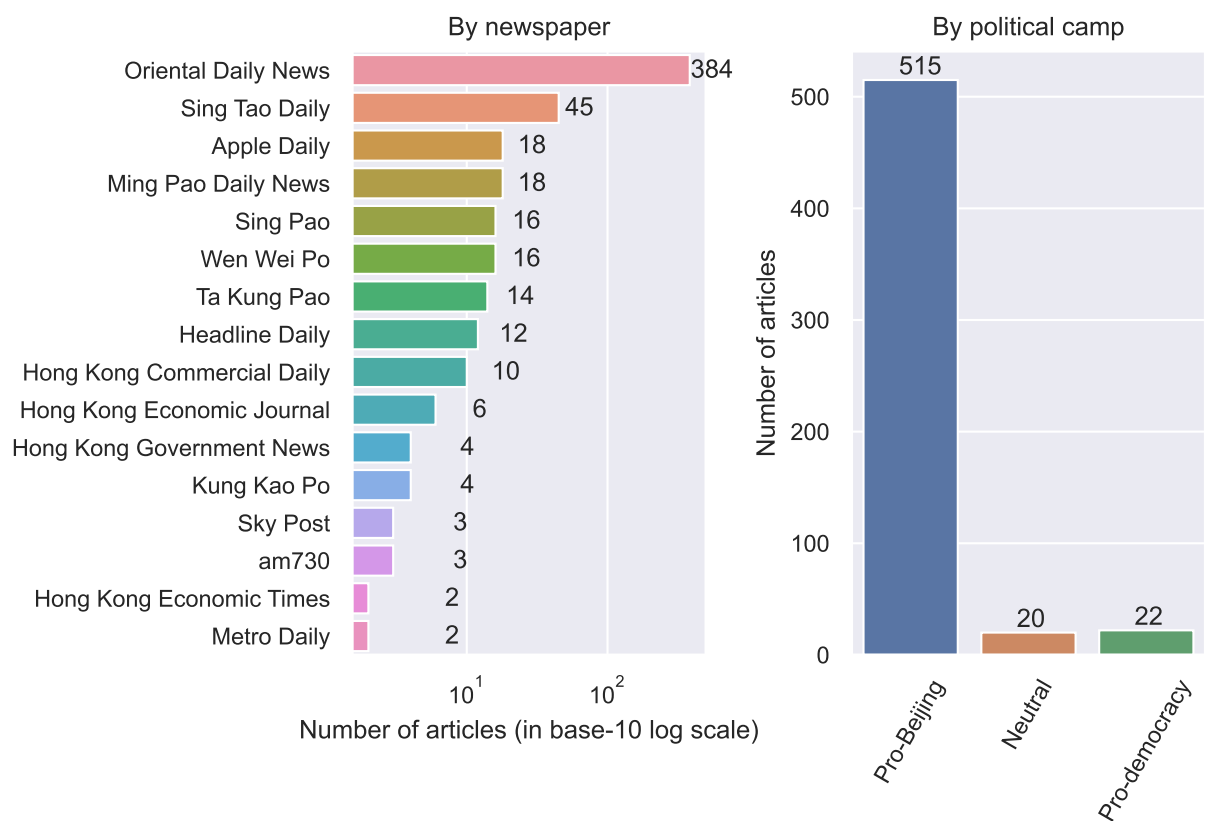


Figure 3.1: News articles on asylum seekers in 2019 by news outlet (left) and political camp (right)

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popularity, and the forced closure of this outlet was also reported as one of the greatest shocks towards the city's freedom of press by foreign media outlets like the BBC (Tan 2021). As for *Kung Kao Po*, it is a weekly published newspaper founded in 1928 for the Catholic Hong Kong Diocese which often organised religious events to commemorate pro-democracy protests such as the Umbrella Movement (Kung Kao Po 2019), and given Hong Kong has around 12% of its population identifying as Christians with some of the believers being quite vocal and prominent in pro-democracy activism (Hitchens 2021), the reportage of this newspaper on asylum seekers in Hong Kong can thus be treated as representing the narrative on this issue via the perspective of pro-democracy Christians. Therefore, even if these two pro-democracy outlets published much fewer articles than the pro-Beijing camp outlets on non-refoulement claimants, they may still carry influence over the public's perception towards asylum seekers within the city via framing this issue due to their considerable reader bases.

As for the neutral outlets, it is necessary to include their articles on non-refoulement claimants into the dataset because they also occupy an important role in Hong Kong's media industry by providing objective media coverage which avoids explicit political allegiance with a particular camp. Despite the controversial change of chief editorship in 2014, Lee (2018) argues that Ming Pao has established itself as one of the "widely circulated, influential and credible" (p.12) outlets in Hong Kong since the 1980s, and its owner *Tiong Hiew King* has rather emphasised that Ming Pao report news objectively similar to the Chinese-language newspapers under his ownership in Malaysia. Likewise, being the first free printed newspaper available in Hong Kong from 2002 to 2019 (which then became an online newspaper since 2020) as the localised edition of *Metro International*, including Metro Daily as one of the outlets covered in the dataset can also help investigate whether and how local editions of international media may pay attention to the issue of asylum seekers in Hong Kong (as it turned out, Metro Daily hardly covered this issue during 2019).

In short, even if the number of articles on non-refoulement claimants published by neutral and pro-democracy media outlets included in the dataset was small, their reportage should still be able to reach out to a considerable amount of audience to potentially influence the latter's perception towards asylum seekers because of the outlets' wide circulation as well as their status as some of the leading media outlets in their respective political stance.

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3.4.2 Dependent variable (a.k.a target variable)

As mentioned before, the dependent variable of H_1 will be the sentiment of the news articles towards asylum seekers in the polarities of *positive*, *neutral* and *negative*. But how exactly should these three polarities mean in this context? Referring to the literature can help devise a sound coding scheme. Drawing from McKay et al. (2011), Cooper et al. (2017) and Ng, Choi, et al. (2019), *positive* articles usually acclaim the person or event in concern, describe personal stories, report expert opinions without derogatory terms or depict refugees favourably, *neutral* articles simply report an incident without an overt sentiment or opinion towards particular stakeholders and with little interpretation by the journalists, and *negative* articles frame asylum seekers either as bringing problems to the host society or use inaccurate terms to delegitimise this group of population. I will follow these coding criteria for the polarities of the news articles in the dataset since these definitions suit the purpose of this study. The numerical representation of the polarities in the dataset will be as follows, namely, positive articles will be coded as 2, neutral articles will be coded as 1, and negative articles will be coded as 0.

For the context of Hong Kong about the “incorrect” terms and information used for describing asylum seekers, I will refer to expert opinions about whether a description of asylum seekers in Hong Kong can be treated as valid⁶. For example, Ng, Choi, et al. (2019) point out that the term “fake/bogus refugees” (*jia3 nan4min2*) should be considered as both derogatory and inaccurate because those applying for non-refoulement claims are not automatically qualified as refugees while awaiting the final decisions of their applications. *Therefore, the polarity of news articles in which the news media directly refers non-refoulement claimants as “fake refugees” in its reportage will be coded as negative, but the report should be coded at least as neutral instead if the news outlet is merely quoting someone who describes non-refoulement claimants as “fake refugees”.* Furthermore, Ng (2020) mentions that non-refoulement claimants are forced to be illegal immigrants by the policy design of the HKSAR Government so that this group of population can be excluded from social rights that legal residents enjoy. News articles equating non-refoulement claimants as illegal immigrants will thus also be coded as negative since such reportage is justifying

⁶A detailed discussion of the depiction of asylum seekers in Hong Kong can be found in Ng (2020) and Ng, Choi, et al. (2019).

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the exclusion of non-refoulement claimants by resorting to their illegality that had been forced upon by the HKSAR Government.

3.4.3 Control variables (a.k.a features)

I will also incorporate some control variables to see if the association between political camps and polarities of the news articles still remains significant afterwards. For starters, the time when the articles were published will be included as a control, though I will bin the twelve months into four evenly split quarters (*Quarter*) to avoid this category from having too high cardinality which may hamper the performance of tree-based models⁷, with Q1 covering from January to March, Q2 covering from April to June, Q3 covering from July to September, and Q4 covering from October to December. As 2019 was also the year when one of the most large-scale and long-lasting pro-democracy protests broke out, it would be interesting to see if the polarities of the news articles might vary according to in which Quarter it was published, and one could argue that the anti-extradition law witnessed some of the most intense conflicts during Q3 and Q4.

Moreover, the presence of racial labels in the news articles will be included as a control since it is possible that more overtly racialised discourse may be associated with more negative sentiments towards asylum seekers in general according to the literature. This variable will be named *Racial_label* in the dataset and will be binary, with 1 meaning there is presence of racial labels in the main text and 0 otherwise. Racial labels referring to both regional (e.g. South Asia, Africa) and national (e.g. the nationalities included in figure 2.2) will be counted. Lastly, the metadata of the news articles, namely the character counts of titles and main texts, will also be added to see if the lengths of the articles may be associated with their sentiment towards asylum seekers.

⁷A detailed discussion of the potential problems posed by highly cardinal categorical features on tree-based models can be found in Ler (2021), but the main issue is that the higher the cardinality of a categorical variable, the more splits will be needed by tree-based models which may then considerably increase the computational costs of the models.

Chapter 4

Results

After the data collection process, there were in total 557 articles published in 2019 by 16 newspapers which reported on non-refoulement claimants residing in Hong Kong. I will first preliminarily explore the variables in the data set before moving to sentiment analysis with machine learning models to find out whether the political camp of media outlets is associated with the polarity of the news articles towards asylum seekers. Interpretation of the model's results will be provided afterwards.

4.1 Exploratory data analysis (EDA)

4.1.1 Number of news articles by month

Figure 4.1 shows how the number of news articles on non-refoulement claimants varied by month in 2019. It appears that coincidentally, there were fewer articles about asylum seekers published between August and November when some of the most intense clashes (notably the siege of the Hong Kong Polytechnic University in November 2019) took place, and only until December did the amount of published articles about non-refoulement claimants rebound to the level in July. As for the first half of 2019, the amount of articles published by month fluctuated quite a bit as seen from the zig-zag pattern of the line graph during this period.

4.1.2 Polarities of the news articles

According to table 4.1, the polarity of the news articles about asylum seekers in Hong Kong in 2019 tilted towards *negative*, since only around 4.3% and 23.5% of articles depicted asylum seekers positively and neutrally respectively. The fact that the sentiment of the news articles in 2019 was skewed towards negativity implies that I will need to take class imbalance into account

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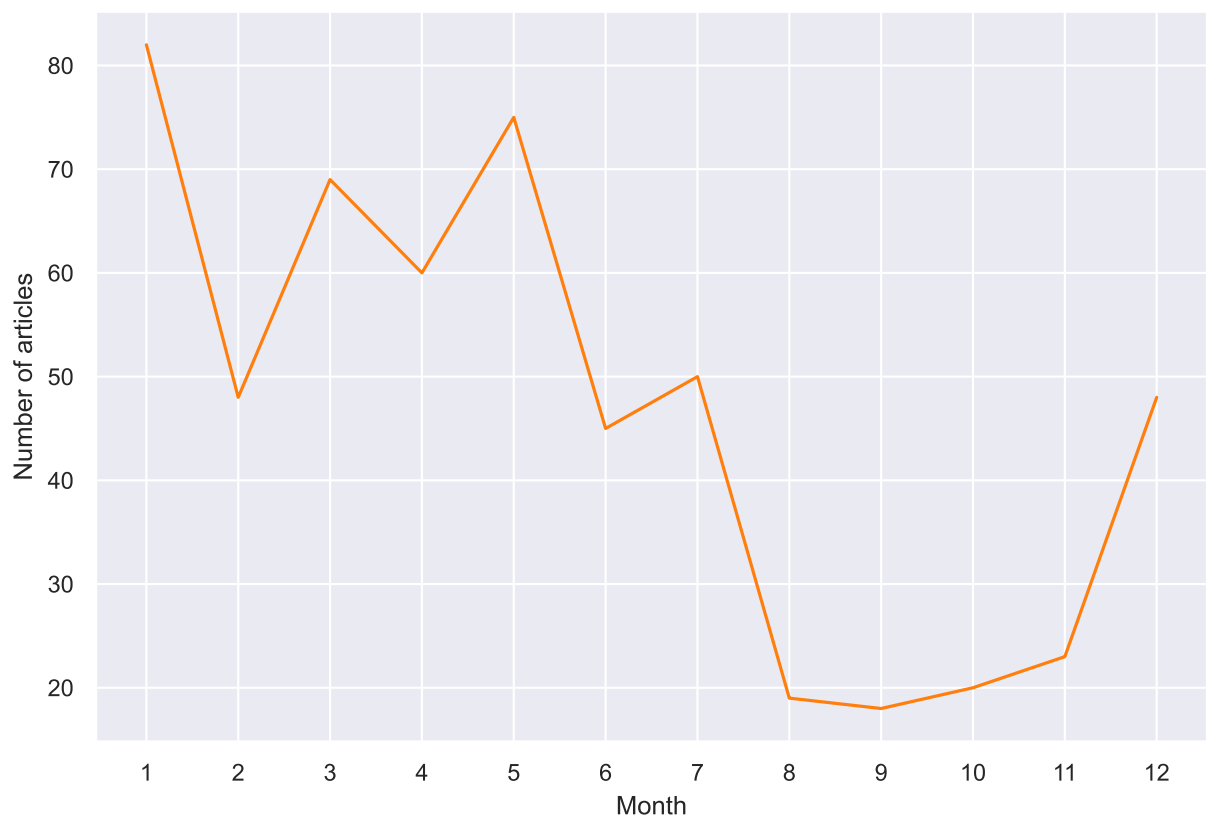


Figure 4.1: The volume of publication of news articles about asylum seekers by month in Hong Kong in 2019

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Table 4.1: Polarities of the news articles (on columns) on asylum seekers by political camps (on rows) in Hong Kong in 2019

	Negative	Neutral	Positive	All
Neutral	0	12	8	20
Pro-Beijing	402	108	5	515
Pro-democracy	0	11	11	22
All	402	131	24	557

for modelling later. Political-camp-wise, pro-Beijing media outlets had over 70% of its articles depicting asylum seekers in Hong Kong in negative lights, whereas neutral and pro-democracy media outlets had their reportage evenly spread between neutral and positive articles (albeit they altogether constituted to only a small proportion of the total number of articles in 2019). While H_1 shall be tested formally with machine learning models after including other control variables later, preliminary evidence suggests that the polarities of the news articles vary with the political camp that the outlets belong to.

4.1.3 Presence of racial labels

Given the majority of asylum seekers in Hong Kong being non-ethnic Chinese, it will also be worth glimpsing whether the presence of racial labels for describing asylum seekers is associated with the sentiment of the news articles. Judging from figure 4.2 preliminarily, however, it appears that the patterns of the polarities are quite similar no matter if news articles contain racial labels or not, namely, most of the articles framed non-refoulement claimants negatively, some reported on events about this group of population neutrally, and only a small amount of articles were favourable towards asylum seekers residing in the city. Machine learning models can test whether there is any association between racial labels and the polarity of news articles more formally later.

4.1.4 Character lengths of news articles and titles

Lastly, let's look at the distribution of the character lengths of the titles and main texts of the news articles. According to figure 4.3 and table 4.2, it appears that both the title and main text lengths have right-skewed distributions. In other words, while most of the news articles on asylum seekers in Hong Kong in 2019 had relatively short titles and/or main texts, a few of them were considerably more verbose than the rest.

4. Results

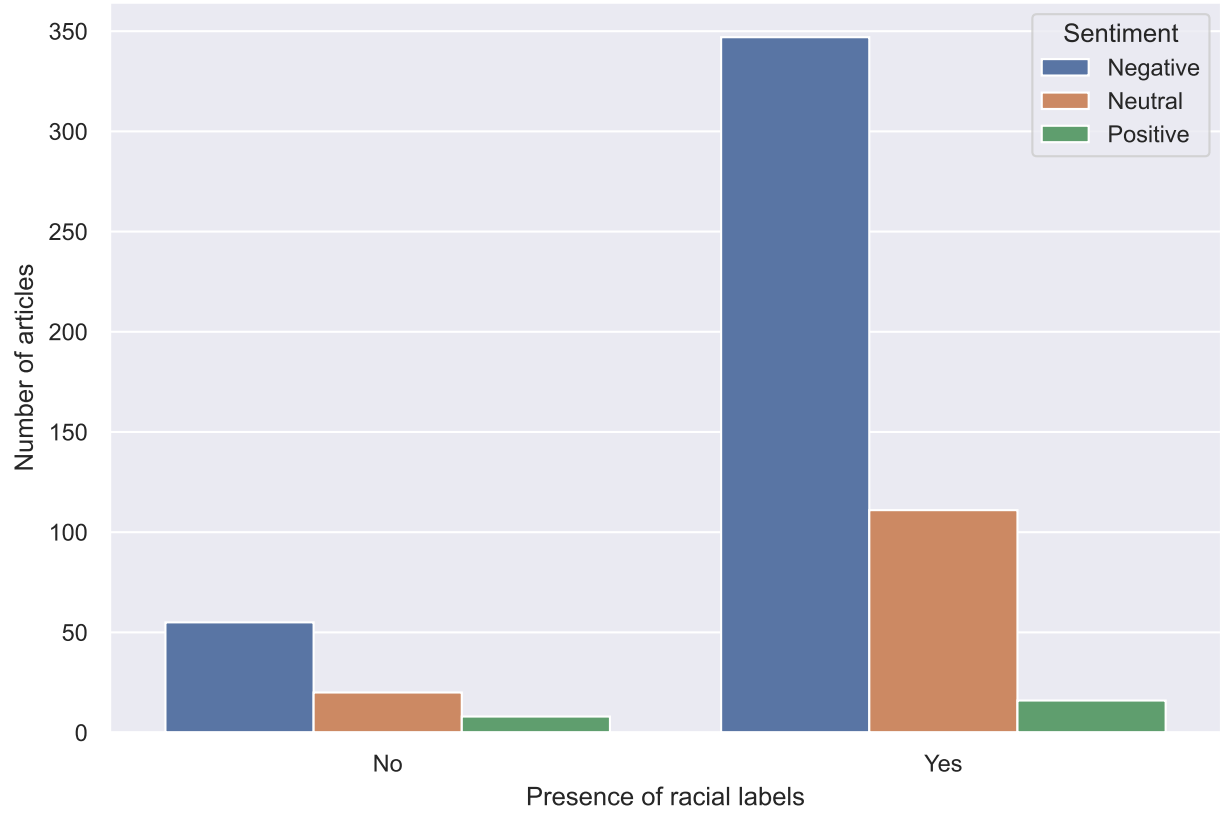


Figure 4.2: Presence of racial labels in the news articles by sentiment in 2019

Table 4.2: Summary statistics of the word counts of the news articles' titles and main texts

	Title	Raw main text
count	557.000000	557.0000
mean	15.965889	683.9264
std	5.993154	453.9607
min	4.000000	80.0000
25%	12.000000	404.0000
50%	15.000000	581.0000
75%	18.000000	893.0000
max	48.000000	4715.0000

4. Results

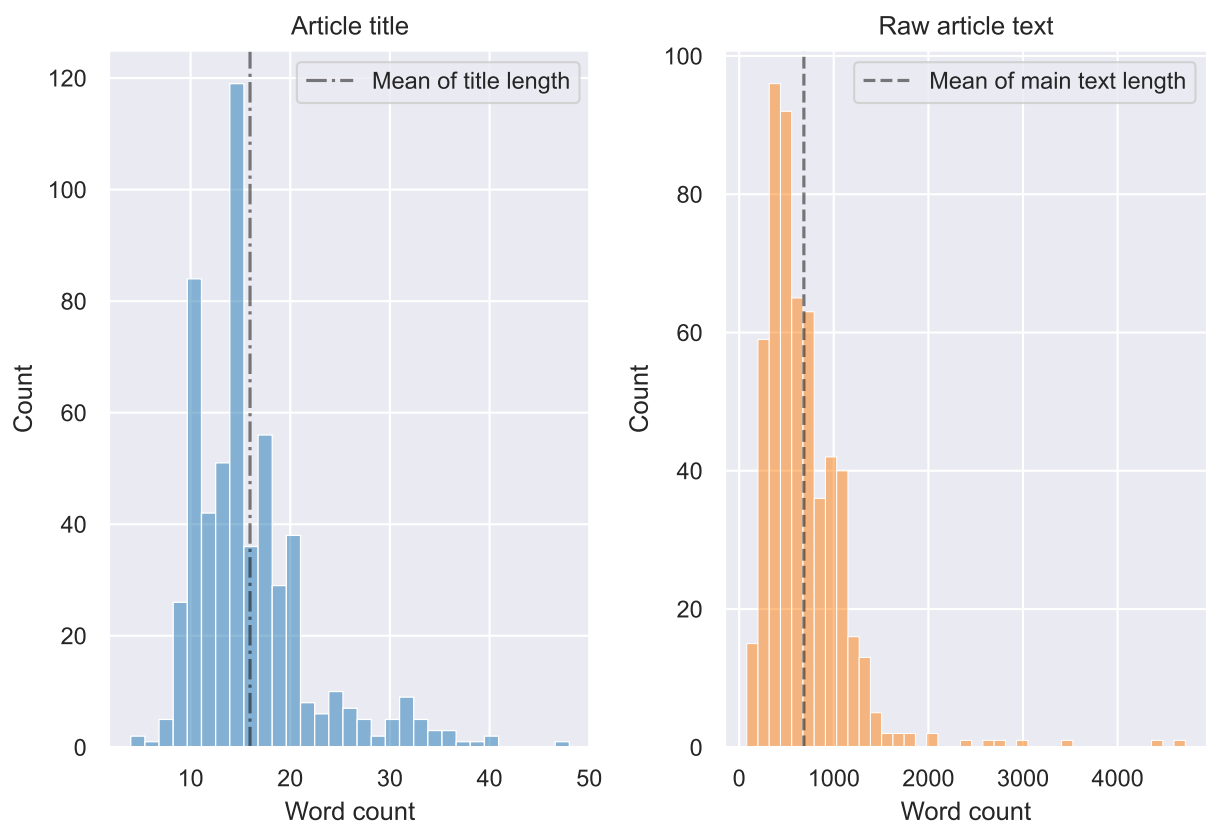


Figure 4.3: Distributions of the word counts of the news articles' titles (left) and main texts (right)

4.2 Sentiment analysis

4.2.1 Pre-processing

After making sense of the dataset with EDA, it is time to build the sentiment analysis model to see whether the political affiliation of news media outlets is associated with the polarities of the news articles after controlling for other variables. But first there are some pre-processing steps to be done so that the data are transformed into suitable formats as inputs for machine learning models. For starters, columns of the metadata should be excluded from being the inputs of the models. Note that I have also removed the `Newspaper` column since H_1 is more interested in whether newspaper outlets of the pro-Beijing camp *as a whole* may hold more negative attitudes towards asylum seekers in Hong Kong vis-a-vis media outlets with other political stances. The removed metadata columns are: `Index`, `Date`, `Category`, `Page_number` and `Newspaper`.

For the categorical features, they will need to be one-hot encoded, meaning that each of them will be transformed into n (i.e. the number of distinct values in each categorical feature) new columns, and the presence of a category will be marked with 1 in the respective column for an observation and 0 for other columns. Meanwhile, it would also be better to standardise the numerical features (i.e. other than `Political_camp`, `Racial_label` and `Quarter`) by centering their means at 0 for better model convergence, but the standardiser should only be fitted on the *training set* after splitting the data into the training and testing sets in order to avoid data leakage (the same is also true for creating the TF-IDF matrix). As mentioned before, 20% of the observations in the dataset will be split into the test data for model validation later.

The next step is to transform both the titles and main texts of the articles into a TF-IDF term-document matrix. Apart from joining the `Title` and `Text` columns together as the complete `Article`, I will also add additional words into the dictionary and remove stop words as well as punctuation for better tokenisation so that the NMF model can better discover the latent topics.

To avoid data leakage as mentioned before, I will only fit the `TfidfVectorizer` and the NMF models on the training set and then use the fitted instances to transform both the train and test data. I set the number of latent topics (`n_components`) as 10 for the NMF model, and this is decided based on figure 4.4 which plots the reconstruction error measuring the difference of the values between the original TF-IDF matrix and the reconstructed version after NMF. Although

4. Results

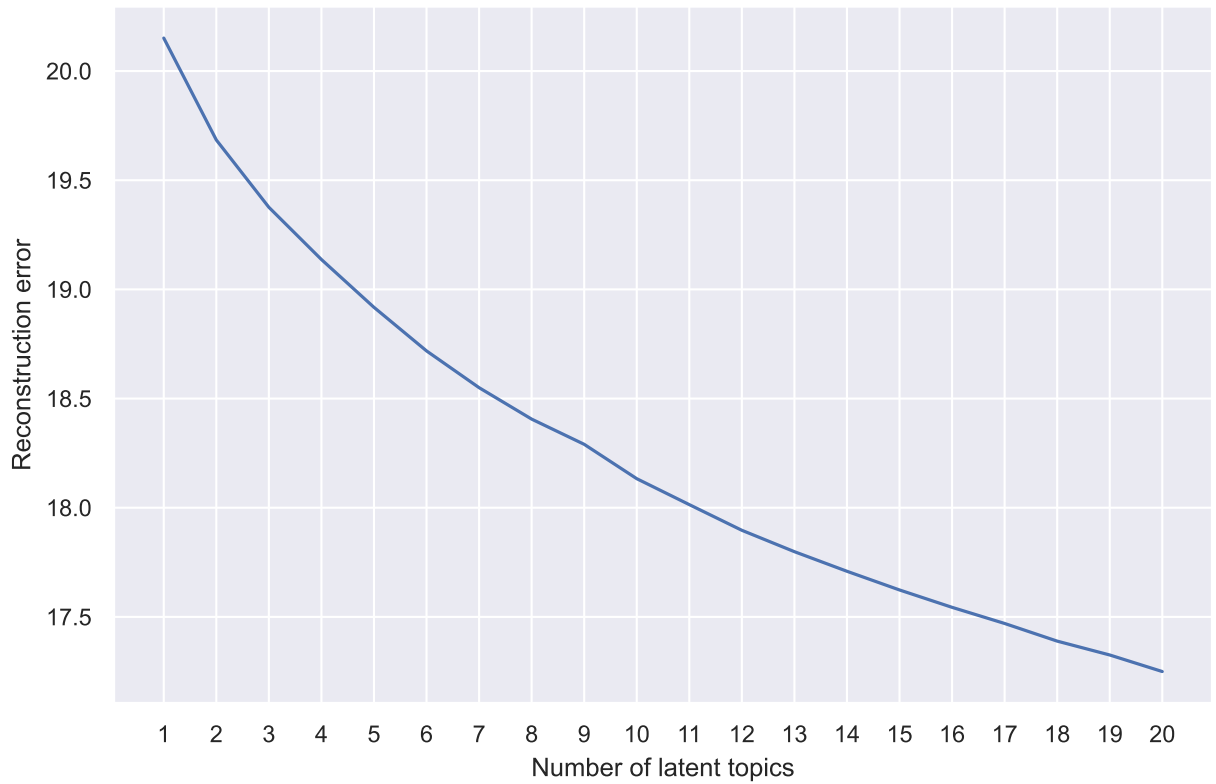


Figure 4.4: Elbow plot of the reconstruction error of NMF as a function of the number of pre-specified latent topics

there are certainly other valid choices of the number of latent topics to be discovered by NMF, 10 appears to be a reasonable choice as a compromise between finding out a wide variety of topics in the corpus and not fitting too much into the noise of the data.

In order to make the latent topics generated by the NMF model be named more intuitive, I will inspect the 30 most prominent words of each latent topic (which are shown in figure 4.5) and then summarise each topic. Overall, the ten topics generated by NMF are more or less semantically coherent. Finally, I will transform the testing set’s articles with the fitted instances of the TF-IDF and NMF models on the training set.

The ten latent topics (from topics 1 to 10) that were discovered by the NMF model can be named as: *crimes*, *non-refoulement legal procedure*, *illegal labours*, *illegal gambling*, *drugs*, *illegal immigration*, *murder*, *robbery*, *South Asian settlements* and *problem and solution*. The *problem and solution* topic refers to the coverage on whether and how non-refoulement claimants should be treated as a social problem and how this should be “solved” accordingly, and it should be

4. Results

Table 4.3: F1 scores on 5-fold cross validation and test data of the baseline models

	5-fold cv f1 score	Test data f1 score
Logistic regression	0.6909535	0.8109777
SVM	0.6946997	0.8032258
Random forest	0.7936016	0.6848406
XGBoost classifier	0.7479415	0.7988271

noted that the scope of this topic is broader than the rest, meaning that there is likely to be more ways of how this topic can be covered by newspapers. The resulting NMF matrix will be in the shape of 557 rows with 10 columns, meaning that each news article will be on its own row in which the 10 columns will indicate the weights of the ten latent topics discovered by the NMF model. The higher the weight of a topic, the more emphasised this topic is in an article, and multiple topics may be co-mentioned within a news articles albeit with different weights.

4.2.2 Training the model

After the above pre-processing steps, it is time to train a machine learning model that can adequately predict the relations between the features and the sentiment of the articles before finding out the importance of political camp as the main independent variable. To facilitate the decision of which model to use, I will first run some baseline models with the default hyperparameters, except that I have adjusted the weights of each class in the dependent variable due to the class imbalance problem mentioned earlier and also set the `early_stopping_rounds` argument to 5 to prevent overfitting while training the XGBoost model¹. Moreover, tree-based models (i.e. random forest and XGBoost) do not necessarily need to have the numerical features standardised, and thus only the categorical columns need to be one-hot encoded. The baseline models will be compared based on their performance on the *macro* average f1 score (which is simply the unweighted average of per-class f1 scores, Pedregosa et al. (2011)) on the testing set and 5-fold cross validation. I chose the macro average f1 score because there is no apparent reason for treating the prediction of one polarity of the news articles to be more important than others.

Table 4.3 contains the performance of the macro average f1 scores of the four baseline models on both the 5-fold cross validation and test data. It seems that the two tree-based models perform better than the two linear classifiers (i.e. logistic regression and SVM) in the 5-fold cross validation.

¹For the complete documentation of the default parameters of the models used in this thesis, refer to the websites of scikit-learn and XGBoost Documentation — xgboost 1.5.1 documentation.

4. Results

Topic 1 (crimes):

南亞 事主 漢 現場 兵團 一名 受傷 刑事 報警 調查隊
警方 犯案 調查 附近 案件 凌晨 兩名 男子 事件簿 歲
送院 警區 治理 追緝 逃 初步 接報 進 求助 交由

Topic 2 (non-refoulement legal procedure):

聲請 處理 司法覆核 個案 免遣返聲請 提出 上訴 立法會 宗 法律
入境處 政府 審核 程序 假難民 保安局 遣返 條例 修訂 建議
議員 相關 問題 年度 當局 提交 考慮 指 申請 司法機構

Topic 3 (illegal labours):

入境處 非法 黑工 勞工 監禁 被判 工作 僱傭 聘用 介乎
被捕 年齡 行動 定罪 最高 僱主 一經 離境 十五 罰款
工行 月 餐廳 擔保書 拘捕 一名 入境者 涉嫌 女子 身份

Topic 4 (illegal gambling):

遊戲機 賭檔 中心 黑幣 賭博 仔 賭博場 行動 賭客 警方
持牌 非法 包括 魚機 遊戲 經營 釣 機 戲機 積分
被捕 釣魚機 集團 南亞 現金 三合 機及 人士 舖 萬元

Topic 5 (drugs):

毒品 檢獲 約 販毒 海關 大麻 單位 警方 行動 懷疑
男子 分銷 可卡因 被捕 市值 拘捕 鈔 涉嫌 調查 冰毒
職務隊 搜查 探員 追查 來源 特別 南亞 公斤 製 報

Topic 6 (illegal immigration):

人蛇 水警 偷渡 蛇頭 偷渡客 來港 南亞 搶灘 非法入境 西貢
截獲 警方 一艘 巴基斯坦 船 集團 屯門 八名 可疑 發現
水域 深圳 安排 拘捕 船上 裔 西分區 昨晨 籍 海里

Topic 7 (murder):

死者 房 劊 妻子 男子 殺 警方 單位 非洲 行街紙
死亡 同鄉 傷痕 歲 住客 殺案 謀 謀殺 調查 印度
印度籍 發現 爭執 土瓜灣 海防道 九龍城 被捕 昏迷 床上 被告

Topic 8 (robbery):

事主 背囊 賊 搶 休班 匪徒 黃埔 兩名 換店 紅磡
刀 警長 一名 現金 巨款 找 男子 萬元 匪 制服
牛肉 逃 截劫 疑匪 劫 劫案 南亞 合力 疑犯 德安街

Topic 9 (South Asian settlements):

南亞 村 拆 木板 新村 橋底 屋 清 露宿 村民
政府 通州街 深水埗 居民 區議員 公園 部門 天橋底 衛 生
街坊 搭建 渡船街 雜物 油麻地 治安 更 假難民 垃圾 吸毒

Topic 10 (problem and solution):

港府 假難民 香港 政府 說 難民 問題 社會 市民 治安
南亞 做 派 更 政策 港人 沒 政治 港 退出
長 毒瘤 禁閉營 移民 加拿大 解決 法治 錢 美國 億元

Figure 4.5: Word list of each of the topics generated by the NMF model

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Table 4.4: F1 scores on 5-fold cross validation and test data of the baseline and tuned XGBoost models

	5-fold cv f1 score	Test data f1 score
Baseline	0.7479	0.7988
Tuned	0.7616	0.8814

Table 4.5: F1 score breakdown of the tuned XGBoost model on the test data

	precision	recall	f1-score	support
0	0.9136	0.9136	0.9136	81.000
1	0.7308	0.7308	0.7308	26.000
2	1.0000	1.0000	1.0000	5.000
accuracy	0.8750	0.8750	0.8750	0.875
macro avg	0.8814	0.8814	0.8814	112.000
weighted avg	0.8750	0.8750	0.8750	112.000

Eventually, I decided to go forward with the XGBoost model because the random forest model's f1 score on the test data is more than 0.1 less than that on 5-fold cross validation which is indicative of over-fitting, whereas this was not the case for the XGBoost baseline model. Therefore, I will proceed with XGBoost for hyper-parametering tuning to see if the model's performance can be improved².

The comparison of the baseline and tuned model's performance in f1 score can be found in table 4.4³. As expected, the tuned XGBoost model performs better on both 5-fold cross validation and the test data (although the magnitude of the increase of the f1 score on the test data should be taken with a grain of salt because of the small number of observations available in the dataset as mentioned before). Table 4.5 further breaks down the f1 score of the tuned XGBoost model on the test data. I will thus calculate the SHAP values of the features with the tuned XGBoost model given its better overall performance.

²The code for tuning the model via the package hyperopt with Bayesian optimisation can be found in the appendix.

³Hyper-parameters of the tuned XGBoost model used here are: {'objective': 'multi:softprob', 'use_label_encoder': False, 'base_score': 0.5, 'booster': 'gbtree', 'colsample_bylevel': 1, 'colsample_bynode': 1, 'colsample_bytree': 0.6000000000000001, 'enable_categorical': False, 'gamma': 0.5, 'gpu_id': -1, 'importance_type': None, 'interaction_constraints': '', 'learning_rate': 0.37, 'max_delta_step': 0, 'max_depth': 5, 'min_child_weight': 3.0, 'missing': nan, 'monotone_constraints': '()', 'n_estimators': 40, 'n_jobs': 16, 'num_parallel_tree': 1, 'predictor': 'auto', 'random_state': 1, 'reg_alpha': 0, 'reg_lambda': 12.0, 'scale_pos_weight': None, 'subsample': 0.7000000000000001, 'tree_method': 'exact', 'validate_parameters': 1, 'verbosity': None, 'eval_metric': 'mlogloss'}. To reproduce this model, simply create an XGBClassifier instance, copy the above hyperparameters as a dictionary and then use the .set_params(**dict) method on the XGBClassifier instance.

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4.3 Results: was pro-Beijing media outlets more likely to negatively portray asylum seekers in Hong Kong in 2019?

This section will report the findings of how important each feature contributed to the model's prediction of the sentiments of the news articles on asylum seekers in Hong Kong by media outlets in 2019. Apart from reporting on whether affiliation with the pro-Beijing camp of media outlets is an influential feature for predicting each of the polarities, I will also mention other noteworthy findings. The data points used for constructing the SHAP values are from the training set. According to the documentation of the `TreeExplainer` class used for generating SHAP values of tree-based ensemble models (*Shap.TreeExplainer SHAP Latest Documentation n.d.*), in the case of classification tasks, the model output explained by SHAP values with regard to the features is the *log odds ratio*. Consequently, positive SHAP values (i.e. increasing log odds ratio) mean that an observation is more likely to belong to a certain class, whereas negative SHAP values (i.e. decreasing log odds ratio) implies that an observation is less likely to belong to a certain class.

4.3.1 Overall magnitudes of SHAP values for each feature

With the trained model at hand, we can now answer whether H_1 is supported by the model's results using SHAP values. According to figure 4.6, we can see that on the level of the whole model, whether a media belongs to the pro-Beijing camp or not (`Political_camp_Pro-Beijing`) is the third most important features in predicting the sentiment of a news article, and its magnitude of SHAP values in affecting the model's output is only lower than those of two news article topics about asylum seekers (i.e., `Problem and solution` and `Murder`) while being slightly higher than that of articles on the topic of `Crimes`. Furthermore, within the bar of the SHAP values of the `Political_camp_Pro-Beijing` feature, we can see that pro-Beijing affiliation of media outlets is considerably more informative for predicting whether an article has positive polarity (`Class 2`) or not and has negative polarity (`Class 0`) or not, but not so much while predicting if an article has a neutral polarity (`Class 1`) or not. Therefore, it seems that pro-Beijing media outlets do tend to differ their sentiments on the reportage of asylum seekers in Hong Kong compared to other non-pro-Beijing outlets.

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It should also be noted that contrary to expectation, `Racial_label` is not an informative feature in predicting the sentiment of the articles since its magnitude of SHAP values is at the bottom five out of all features. One potential reason may be that the connotation between non-ethnic Chineseness and non-refoulement claimants is quite salient that these two labels are often used together by newspaper outlets no matter the sentiment or attitudes towards asylum seekers in Hong Kong. Furthermore, the sentiments of the news articles do not seem to correlate with in which quarter they were published nor the length of the news articles *titles*.

Nevertheless, figure 4.6 does not really show the *direction* of the SHAP values of each feature in affecting the model's output. We can therefore use the beeswarm summary plots from the `shap` package which also shows the directions of SHAP values for predicting each class in the dependent variable as each feature's value changes. The importance of the features is arranged in descending order on the y-axis from top (the most important) to bottom (the least important). In a SHAP value beeswarm summary plot, dots in black mean the value of a feature is high (or present in case of a binary feature, e.g. one-hot-encoded columns), whereas those in white mean the value of a feature is low (or absent in the case of a binary feature). Moreover, dependence plots which zoom in the relationships between the feature values (on the x-axis) and SHAP values (on the y-axis) of the eight most important features will be provided.

A little note on how to interpret the findings from the beeswarm summary and dependence plots. Each plot will show the SHAP values of each feature to assess whether a feature's value away from its baseline will increase or decrease the model's prediction of the log odds ratio that an observation belongs to a certain class. For instance, if feature A's SHAP value for class 0 increases as its value becomes larger, then this means the model will predict that an observation is more likely to belong to class 0 as feature A's value becomes larger.

4.3.2 SHAP values of predicting negative news articles

According to figure 4.7, pro-Beijing affiliation (`Political_camp_Pro-Beijing`) is the third most important feature in predicting whether a news article reports on asylum seekers in Hong Kong negatively or not. Consistent with the expectation in H_1 , articles published by pro-Beijing media newspapers are more likely to report on asylum seekers negatively than those by outlets with

4. Results

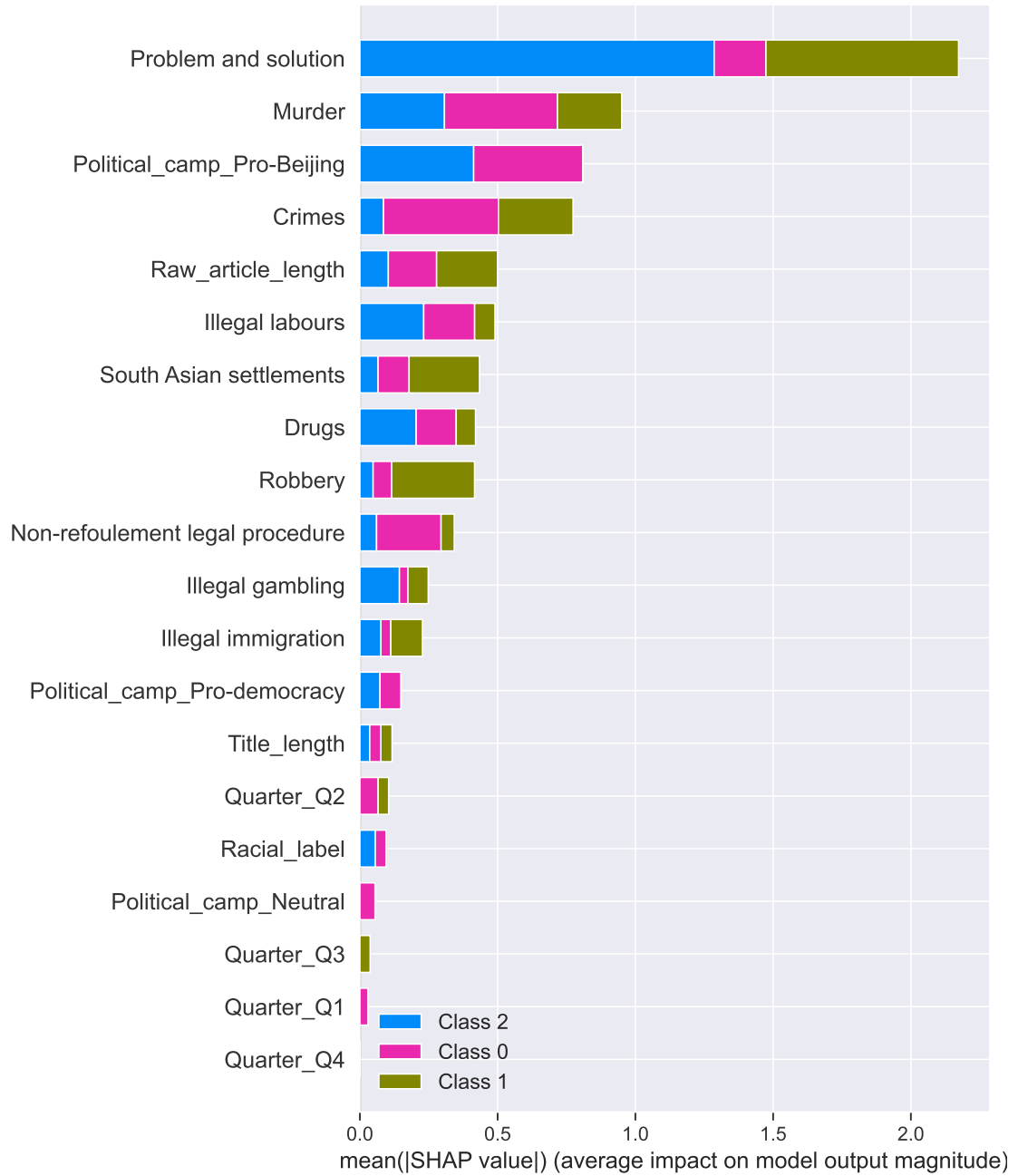


Figure 4.6: Magnitudes of SHAP values of each feature for all classes

4. Results

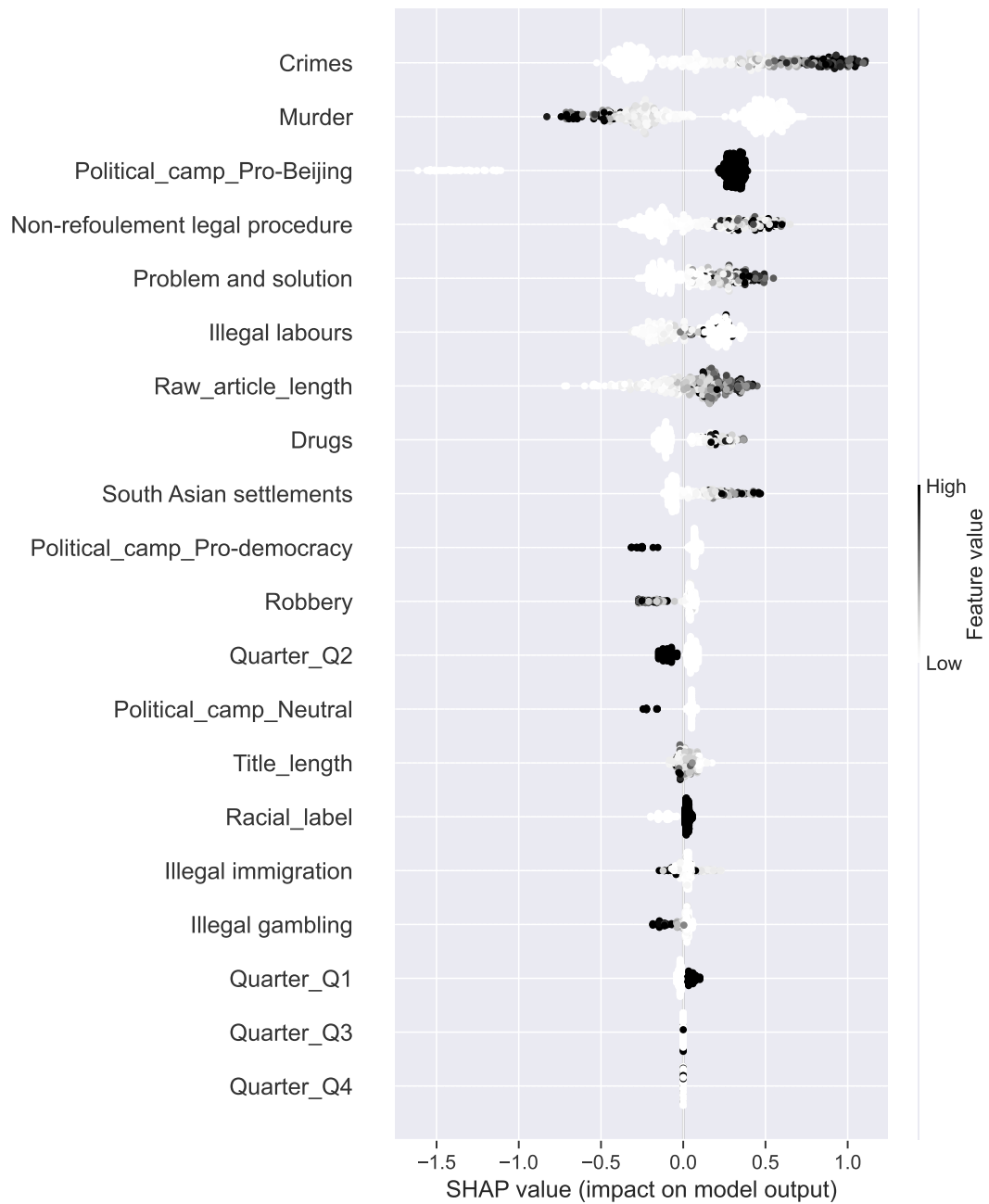


Figure 4.7: The SHAP values of the features in the prediction of whether an article has a negative polarity

4. Results

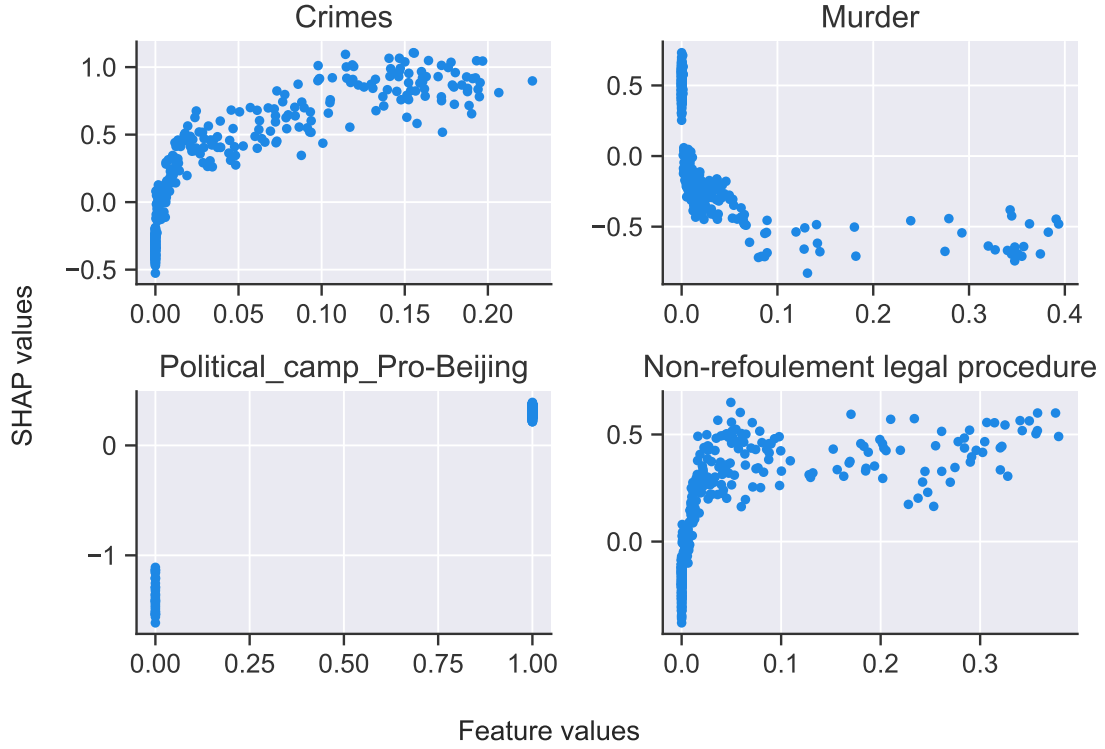


Figure 4.8: Dependence plot of the eight most important features for predicting negative polarity of news articles

different political orientations. Conversely, albeit with less magnitudes in SHAP values, media outlets with neutral (`Political_camp-Neutral`) or pro-democracy (`Political_camp_Pro-democracy`) stances are less likely to publish negative articles on non-refoulement claimants. When it comes to negative articles, therefore, political affiliations of media outlets in Hong Kong do matter, meaning that pro-Beijing camp newspapers are more likely to depict non-refoulement claimants negatively than their counterparts holding other political stances⁴.

Figures 4.8 and 4.9 further zoom into the SHAP values of the eight most important features for predicting the negative polarity of the news articles. Some interesting patterns are observed here. Firstly, articles which are more related to crimes (`Crimes`), the legal procedures of non-refoulement claims (`Non-refoulement legal procedure`) and how non-refoulement claimants may be a problem and the according solutions (`problem and solution`) are more likely to report on asylum seekers negatively. Clues of the potential causes of observing these correlations can be found in the significant topic words associated with each topic shown in figure 4.5. For instance,

⁴Of course, Oriental Daily News contributed to a huge volume of reportage on non-refoulement claimants within the pro-Beijing camp. I will explain why it is not appropriate to re-run the model without including entries from this outlet in the Discussion section below.

4. Results

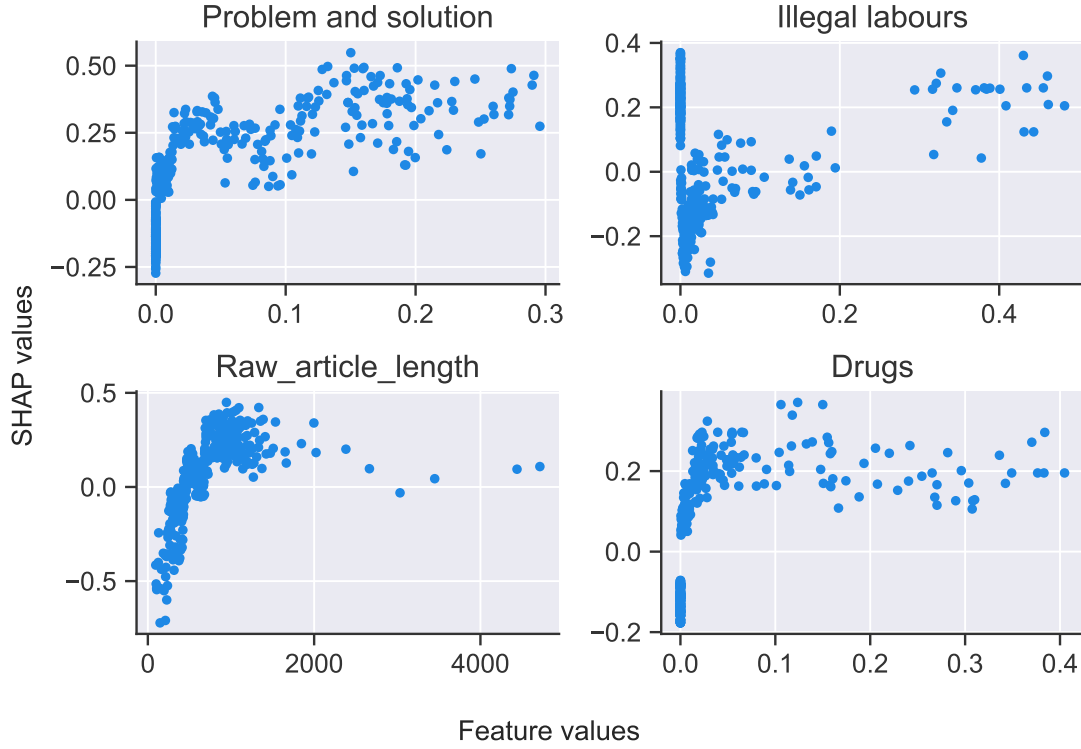


Figure 4.9: Dependence plot of the eight most important features for predicting negative polarity of news articles

both the topics of Non-refoulement legal procedure and problem and solution contain the derogatory term “fake refugee”, whereas the topic Crimes found the noun phrase “South Asian army” (*nan2ya4 bing1tuan2*) as two of the topic words which together attempt to conflate non-refoulement claimants with the image of them being South Asians coming to Hong Kong en masse for committing crimes.

Interestingly, more verbose news articles (i.e. having longer *Raw_article_length*) are also predicted to be more likely for holding negative opinion towards non-refoulement claimants. Lastly, a more pronounced presence of the topics of *Illegal labours* and *Drugs* in a news article appear to be more likely to have a negative polarity against non-refoulement claimants as shown by their SHAP values. Meanwhile, articles focusing on the theme of *Murder* are predicted to be *less likely* for carrying a negative polarity.

4.3.3 SHAP values of predicting neutral news articles

Figure 4.10 shows the SHAP values of each feature in contributing to the model’s prediction of whether a news articles is likely to have neutral polarity towards non-refoulement claimants. Con-

4. Results

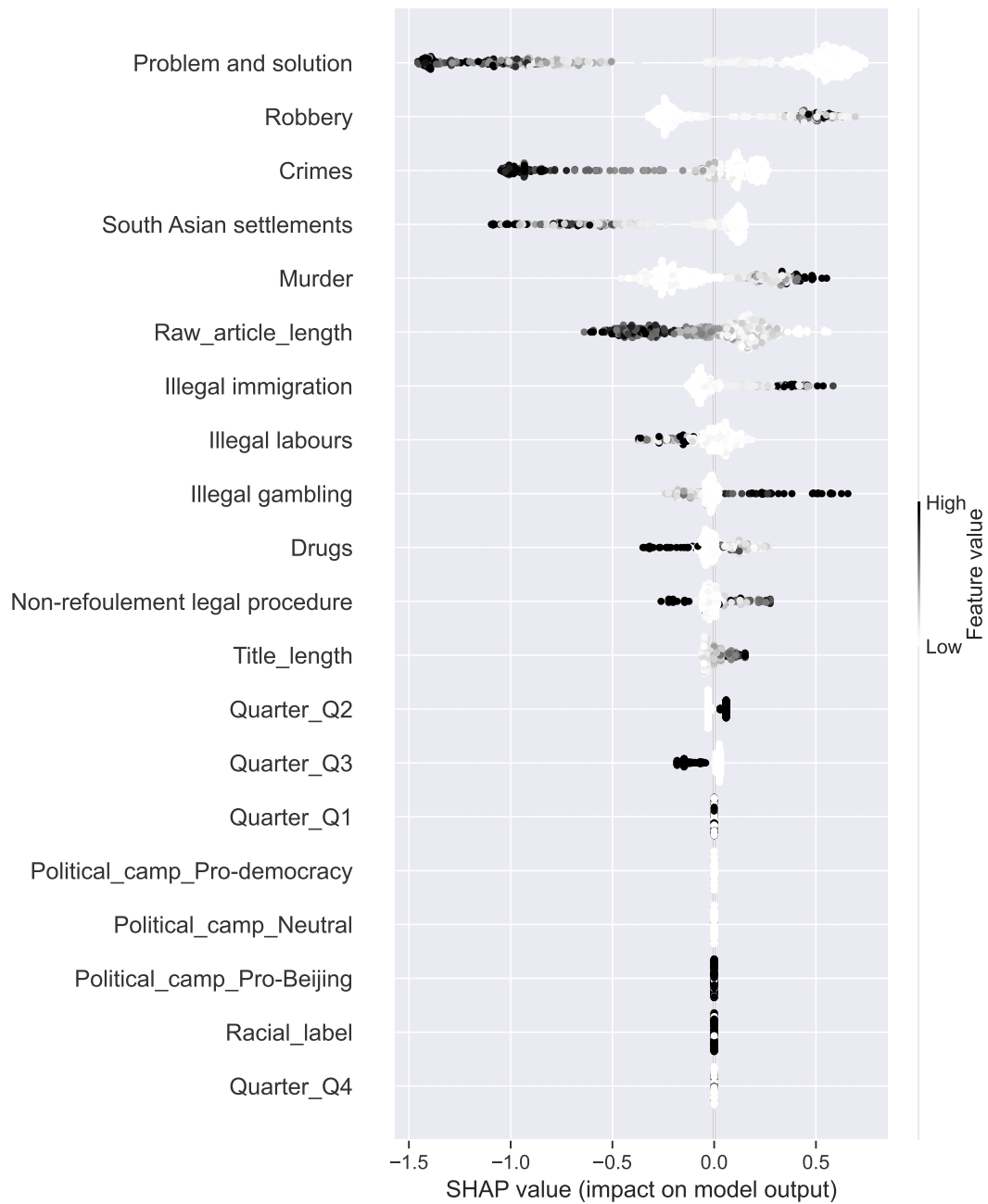


Figure 4.10: The SHAP values of the features in the prediction of whether an article has a neutral polarity

4. Results

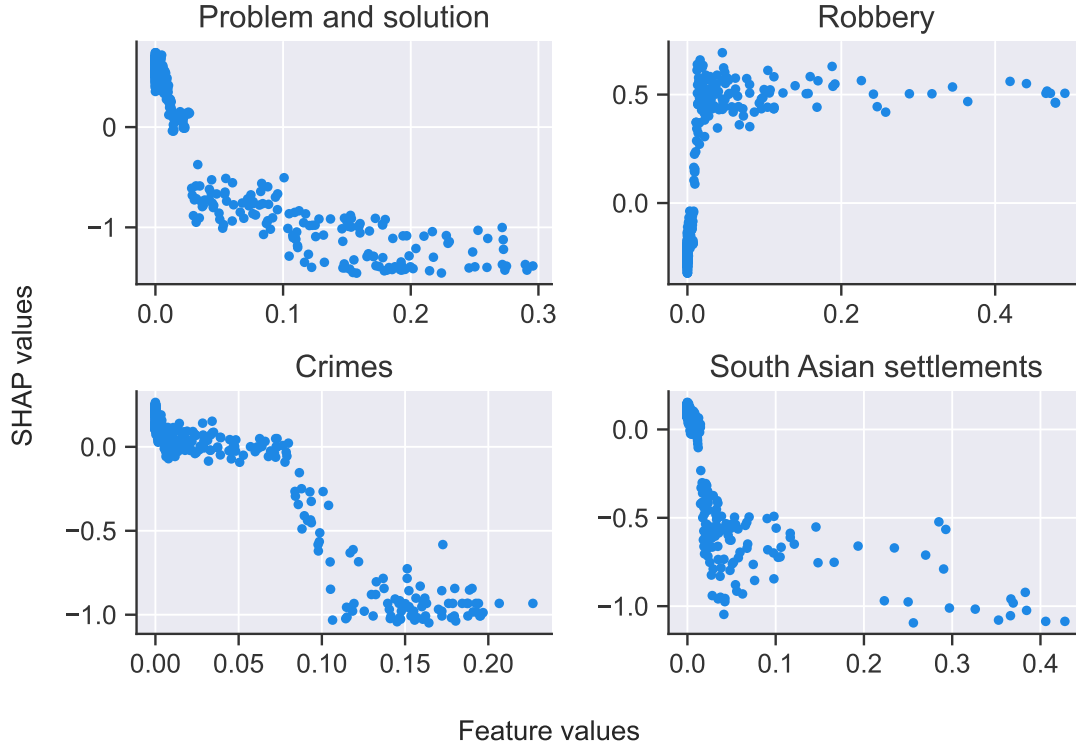


Figure 4.11: Dependence plot of the eight most important features for predicting neutral polarity of news articles

trary to the case of the prediction of negative news articles, the political affiliation of newspaper outlets do not contribute substantively to the model's output, as all three political orientations of newspaper outlets covered in this thesis are located at the bottom five positions on the y-axis, and their SHAP values are essentially zero.

Rather, some topics of the news articles are more informative in predicting whether news articles are more likely to only report incidents without much interpretation by the journalists. We can look into this further in figures 4.11 and 4.12. For instance, articles more related to `problem and solution`, `Crimes`, `South Asian settlements` or `Illegal labours` (albeit with smaller magnitude) are less likely to be written neutrally by newspaper outlets covered in the dataset. In other words, these topics are more likely to be loaded with particular sentiments when they were reported by newspapers in 2019. On the other hand, articles more related to `Robbery`, `Illegal immigration` and `Murder` were generally less loaded with sentiments by newspapers. As the length of the news articles (`Raw_article_length`) gets longer, it becomes more likely that the articles are loaded with conspicuous sentiments towards asylum seekers in Hong Kong.

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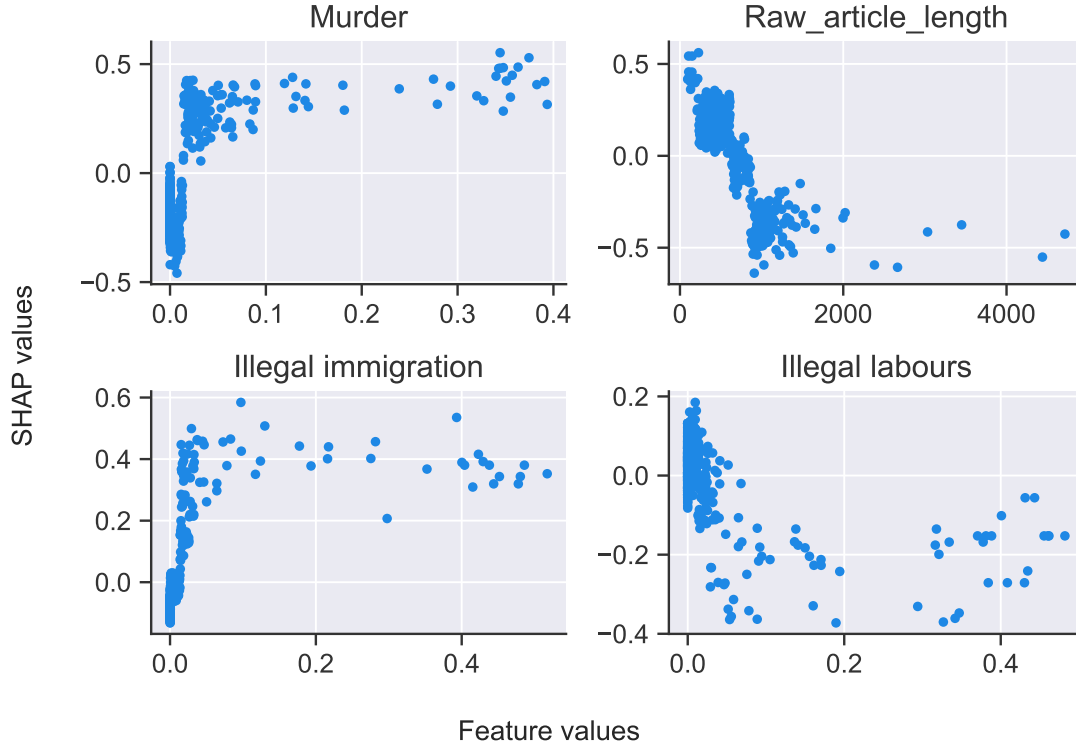


Figure 4.12: Dependence plot of the eight most important features for predicting neutral polarity of news articles

4.3.4 SHAP values of predicting positive news articles

Figure 4.13 shows the SHAP values of the features in predicting whether news articles have a positive polarity towards non-refoulement claimants or not. This time, pro-Beijing affiliation (*Political_camp_Pro-Beijing*) is the second most crucial feature for predicting whether a news articles is likely to depict non-refoulement claimants positively. As expected in H_1 , a newspaper outlet is predicted to be less likely to publish positive articles about asylum seekers if it is associated with the pro-Beijing camp. By contrast, although with a smaller magnitude of SHAP values, pro-democracy newspaper outlets are predicted to be more likely to have favourable reportage on non-refoulement claimants. Meanwhile, neutral newspaper outlets are neither more nor less likely to publish positive articles while reporting on asylum seekers in Hong Kong. In sum, pro-Beijing affiliation of newspaper media in Hong Kong is quite informative for predicting whether an article will portray non-refoulement claimants in positive light, and it is inferred from the model that pro-Beijing outlets are generally less likely to give positive coverage on this group of population.

Figures 4.14 and 4.15 again show the eight most important features on influencing the model

4. Results

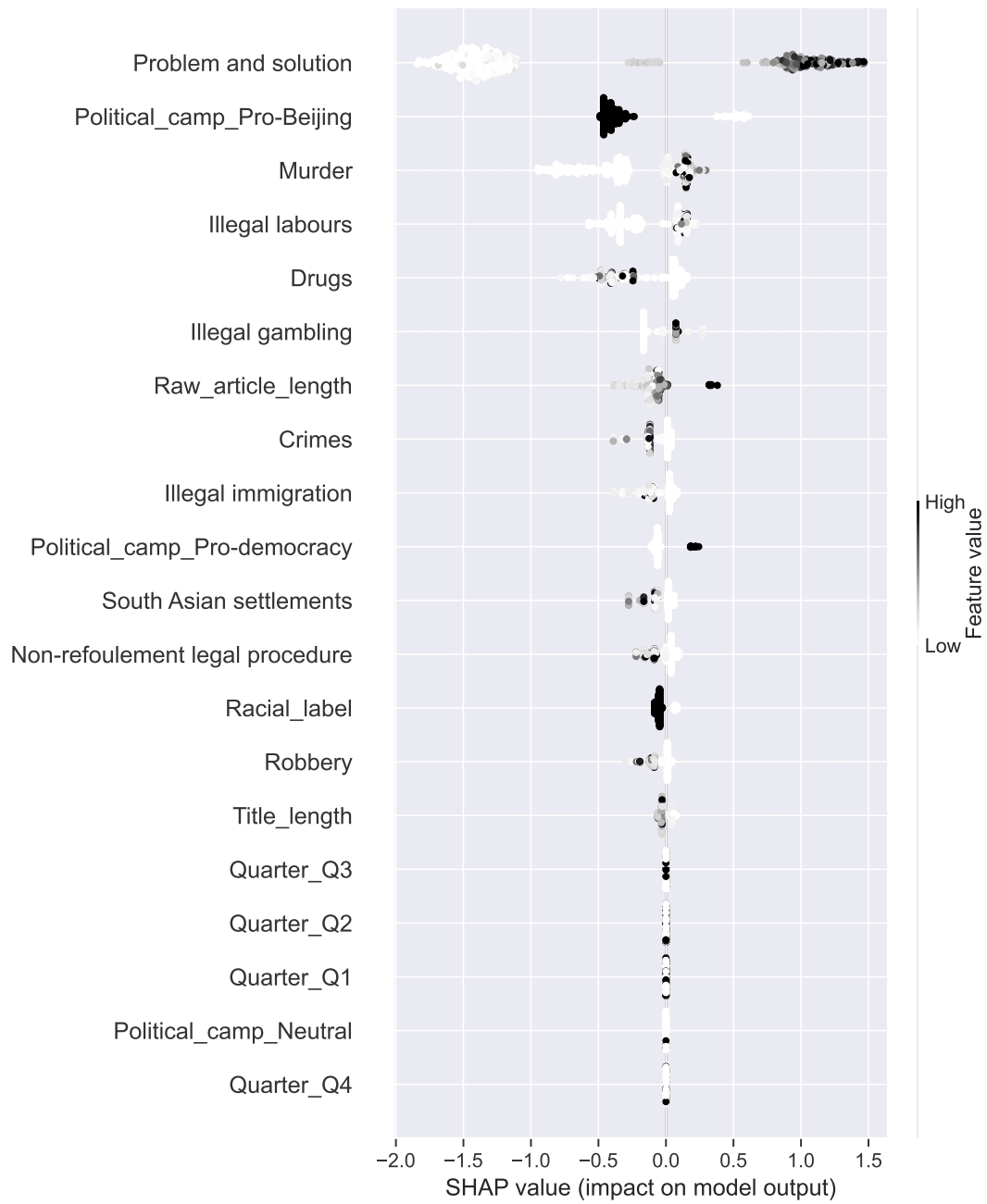


Figure 4.13: The SHAP values of the features in the prediction of whether an article has a positive polarity

4. Results

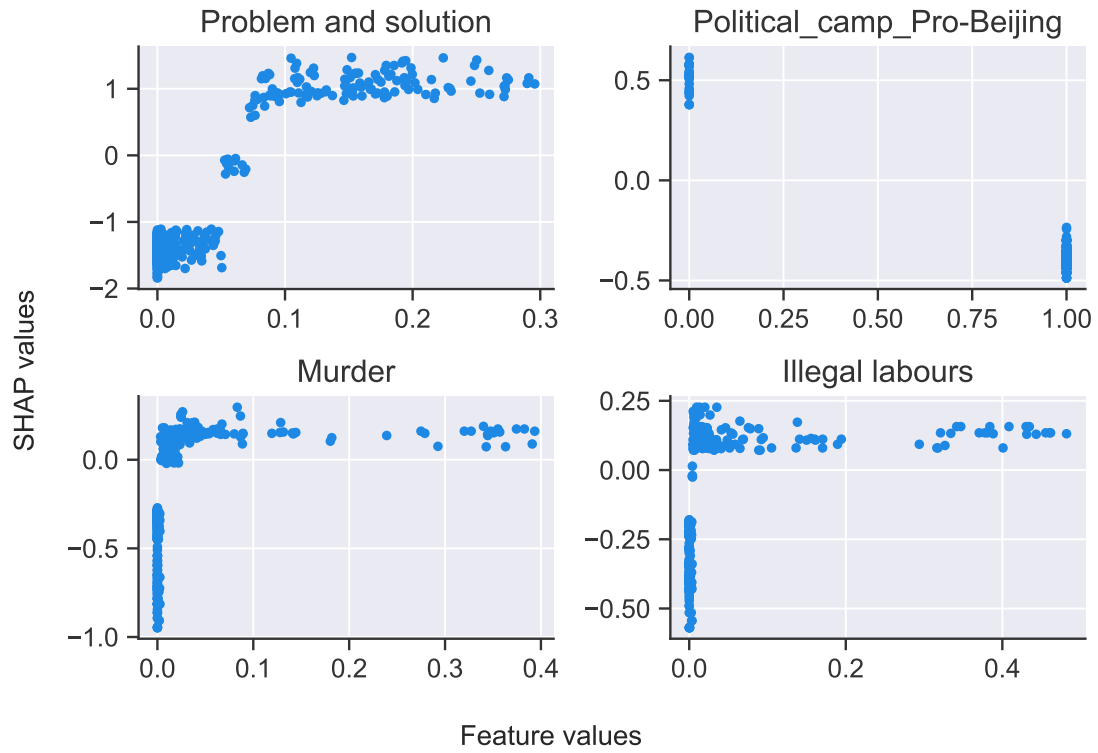


Figure 4.14: Dependence plot of the eight most important features for predicting positive polarity of news articles

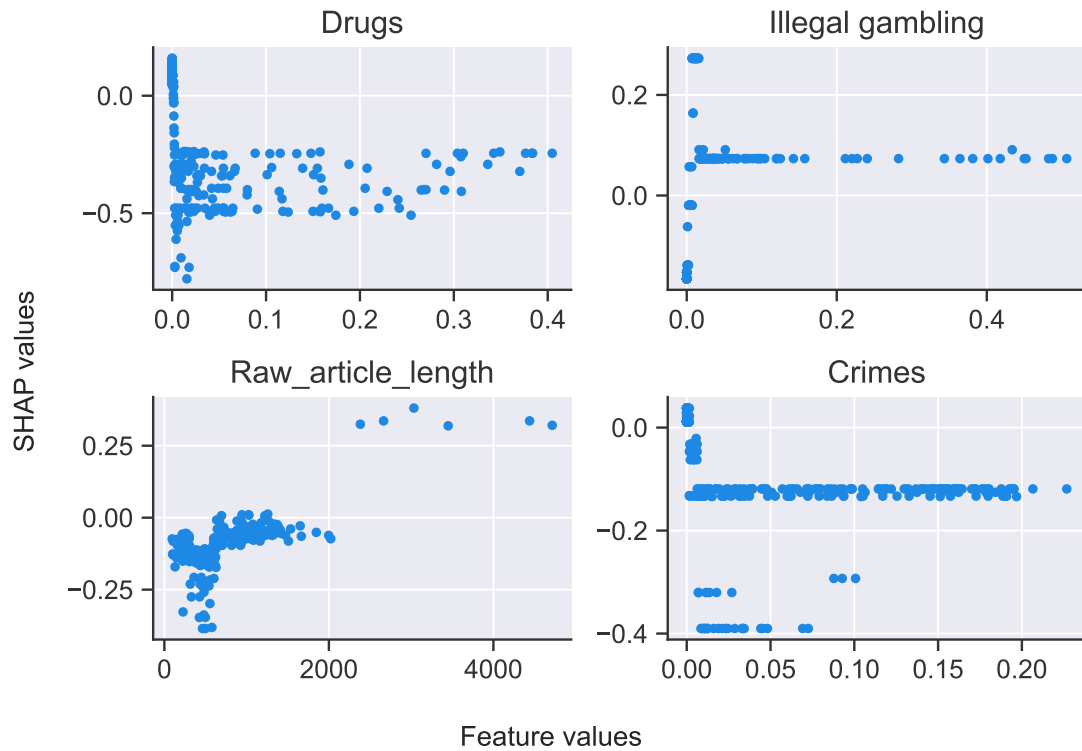


Figure 4.15: Dependence plot of the eight most important features for predicting positive polarity of news articles

4. Results

to predict if a news article has positive polarity or not. Save for `problem` and `solution` (which will be explored later), quite a number of features (namely, `Murder`, `Illegal labours`, `Drugs`, `Illegal gambling` and `Crimes`) do not exhibit clear directions of the relationships between the feature and SHAP values, since the dependence plots of these features show rather “flat” trends of the correlation of these two values. Likewise, after omitting the few outliers in the upper-right quadrant on the dependence plot, `Raw_article_length` also do not show a very clear direction of how increasing the length of news articles may affect the SHAP values. The direction of the correlation between feature and SHAP values for the topic of `problem` and `solution` while predicting whether articles have positive polarity, however, merits further discussion because there appears to have an upward trend of this topic’s SHAP values on the model’s output as the feature value rises which is also the case when the model is predicting whether a newspaper article has a negative polarity. This will be discussed in the next section.

Before investigating the particularities surrounding the correlation between the feature and SHAP values of the `Problem` and `solution` topic, however, it is worth mentioning that due to the severe class imbalance problem for the dependent variable as shown in table 4.1, there are much fewer observations belonging to the positive polarity class in the dataset which will likely cause the variance of the predictions made on this class to be higher than those on the other two classes in the dependent variable. Accordingly, the findings about the associations between the feature and SHAP values of the `problem` and `solution` and `Political_camp_Pro-Beijing` features should be taken with a grain of salt because of the higher degree of uncertainty associated with the predictions on the positive class. Indeed, the lack of sufficient observations belonging to the positive class may also be the potential reason for the model’s inability to discover the relationships between feature values and their impact on the model’s output while predicting the positive class. That being said, the implication of the class imbalance problem goes beyond the modelling process because this can also be indicative of how Hong Kong’s newspaper media cover the issue of non-refoulement claimants in general, and this will be elaborated further in the *Discussion* section.

4.3.5 Problem and solution: a topic possibly with multiple angles by different camps?

The fact that the correlations between feature and SHAP values of the `Problem` and `solution` topic point to the same positive direction for the XGBoost model's prediction of both positive and negative polarities does not necessarily imply that the model is producing contradictory results. Instead, with many more possible way to be illustrated than other topics, it may be possible that the effect of `Problem` and `solution` in affecting the polarities of news articles is conditioned by other features (i.e. there exist interaction effects). This section will look deeper into this possibility with the help of dependence plots.

Based on the formulation of H_1 , figure 4.16 investigates whether there could be any interaction between the `Problem` and `solution` topic and the political affiliation of newspaper outlets (as expressed in whether they belong to the pro-Beijing camp or not). At first glance, both pro-Beijing and non-pro-Beijing newspaper outlets had news articles which emphasise on this topic (as shown by the black dots). Nevertheless, the within-group SHAP values of the news articles for each political camp are rather closely clustered together regardless of whether their news articles covered more or less on the `Problem` and `solution` topics. Ultimately, it was whether a newspaper outlet is affiliated with the pro-Beijing camp (on the x-axis) that clearly separated the SHAP values for the predictions of both negative and positive polarities of the news articles.

A potential reason for this observation is that each camp adopts different approaches and framing while writing on whether non-refoulement claimants in Hong Kong should be treated as a social problem and whether solutions to alleviate this “problem” are warranted. For instance, pro-Beijing newspaper outlets may follow suite the pro-Beijing politicians' hostility against non-refoulement claimants by constantly framing the latter as “fake refugees” (which is one of the topic words included in figure 4.5 for `Problem` and `solution`) to question their legitimacy of seeking refuge in Hong Kong in the first place while also alleging this group of population to multiple wrongdoings. By contrast, neutral newspaper outlets may be more likely to just report on news about asylum seekers in Hong Kong with little interpretation from the journalists, and pro-democracy outlets may even echo the stance of pro-democracy politicians in treating non-refoulement claimants more humanely while they are awaiting for the decision of their applications.

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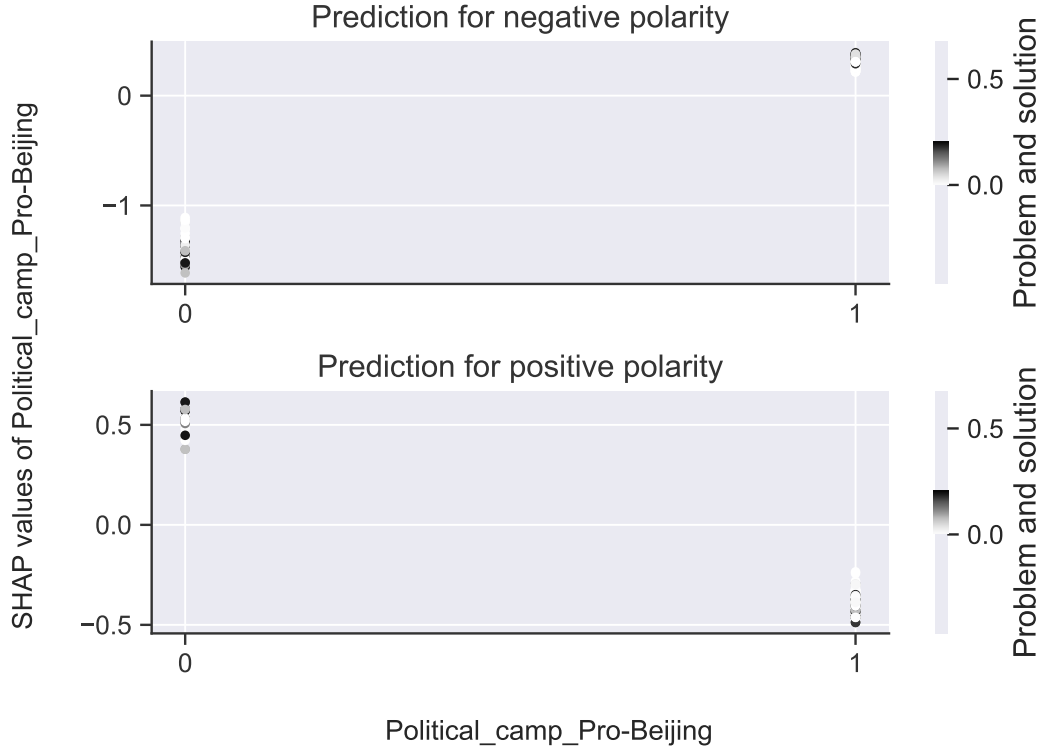


Figure 4.16: Interaction between pro-Beijing affiliation of newspaper outlets and the salience of the problem and solution topic for the XGBoost model’s prediction of the negative (top) and positive (bottom) polarities

While qualitatively investigating how pro-Beijing and non-pro-Beijing newspaper outlets may use different framing to report on the topic of **Problem and solution** is out of the scope of this thesis, this can be a starting point for future research to prompt the dynamic of the contestation between pro-Beijing and pro-democracy (and also the localist camp if possible) camps in attempting to persuade the public about how the issue of non-refoulement claimants in Hong Kong should be perceived. In particular, the anecdotal smearing of the localist camp’s unwillingness to advocate more stringent measures against asylum seekers in Hong Kong by the pro-Beijing newspaper outlets (The Sun 2016) may signal that the issue of non-refoulement claimants may be exploited by political camps to criticise others of not protecting the interests of Hong Kong’s society enough.

4.4 Discussion

Based on the results of SHAP values from the model, it can be concluded that H_1 is supported by the empirical evidence. In other words, a few years since the issue of non-refoulement claimants

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has become more visible in the public debate, pro-Beijing newspaper outlets were more likely to portray asylum seekers negatively than outlets with other political affiliations by 2019 after accounting for how the topics of the news articles might also affect the polarity of reportage. Moreover, certain topics (e.g. Crimes, Non-refoulement legal procedure) are more likely to portray asylum seekers negatively as they are more present in news articles, whereas the Problem and solution topic may be mentioned newspaper outlets from different political camps so differently that the higher presence of this topic in news articles is predicted by the model to increase the SHAP values in predicting both positive and negative polarities.

There are also a few points worth mentioning based on the model's results. For starters, although the class imbalance problem of the Sentiment of the news articles on non-refoulement claimants in 2019 posed a few obstacles during the modelling process, this also suggests that printed newspapers in Hong Kong did not provide as much positive or even neutral coverage as it is the case for negative coverage. This phenomenon is likely contributed by the fact that *Oriental Daily News* was the major newspaper for publishing on the issue of asylum seekers in Hong Kong by 2019 while extensively using the term “fake refugee” among other derogatory descriptions to delegitimise the non-refoulement claimants. On the contrary, neutral and pro-democracy newspaper outlets did publish news about non-refoulement claimants at least without hostility and sometimes even included positive stories, but their combined volume of publication on this issue in 2019 was much smaller than that of pro-Beijing outlets altogether even after excluding articles published by Oriental Daily News. One can thus argue that the pro-Beijing camp was much more attentive than media outlets with other political stances when it comes to reporting news about non-refoulement claimants. This is likely because the pro-Beijing camp would like to convince the public to agree that non-refoulement claimants, despite only constituting to a tiny proportion of Hong Kong's total population of about 7.5 million according to figure 2.1, pose serious problems to the security and well-being of society, and thus pro-Beijing newspaper outlets frequently reported on news related to this group of population in negative light to reinforce the image that non-refoulement claimants are “troublemakers” which should not be welcomed in society.

Related to the publication volume by the pro-Beijing camp, a question about the validity of the results can be that the vast volume of publication by Oriental Daily News might have skewed the pro-Beijing media's attitudes towards asylum seekers to the negative polarity. While it is

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certainly a fact that Oriental Daily News covered non-refoulement claimants disproportionately throughout 2019, dropping out news articles by Oriental Daily News may not be appropriate because this is essentially cutting out a huge part of the pro-Beijing camp's discourse on non-refoulement claimants in the media industry from the analysis which will risk not reflecting the entirety of the camp's media discourse. After all, H_1 is more interested in testing whether the sentiments of news articles towards non-refoulement claimants may differ *by political camp*, and Oriental Daily News is an integral part of the mainstream media network in Hong Kong co-opted by the Beijing Government (Lee 2018).

4.4.1 Snapshots of news articles

It will also be interesting to take some snapshots of how news articles from different political camps may report on non-refoulement claimants in Hong Kong. One way that the pro-Beijing newspapers portrayed non-refoulement claimants negatively in 2019 was accusing the latter of wasting public resources that could have been better used on Hong Kong citizens. For example, the excerpt in figure 4.17 by Oriental Daily News describes non-refoulement claimants as “fake refugees” who are “overrunning” districts in Hong Kong as “armies” and wasting the Government's public resources for processing their applications. Note how the first sentence of this article already connotes non-refoulement claimants with the South Asian racial label, and that their presence in many districts in Hong Kong has destroyed the peace of local citizens and motivated them to emigrate. The last two sentences also express discontent about how the wasted resource on handling the “fake refugee” problem could have been better used for improving the quality of life of citizens in need. In effect, such discourse by Oriental Daily News resembles how the majority ethnic-Chinese population is viewed as a family mentioned by Erni (2012), namely, the non-refoulement claimants from South Asia as outsiders both disrupt the way of life of the local citizens and prevent the Government from prioritising the interests of the local population.

Admittedly, some pro-Beijing outlets attempt to dissociate the so-called “fake refugees” from the ethnic minorities residing in Hong Kong, as the excerpt by *Ta kung Pao* in figure 4.18 blames the “bogus refugees” for tarnishing the reputation of the ethnic minorities who grew up in Hong Kong and are “good citizens”. However, it is unlikely that such separation can substantively reduce prejudices towards ethnic minorities in the sense that the coverage of Oriental Daily News

4. Results

Original:

定風波：港府勿再沽名釣譽

斬草不除根，春風吹又生。針對積重難返的南亞假難民問題.....

不管高官如何鼓其如簧之舌，大肆吹噓積壓的酷刑聲請個案有所減少，但市民面對的現實卻是，全港各區相繼被假難民大軍攻陷，由深水埗通州街天橋底的南亞村，到整個油尖旺地區，再到新界的元朗屯門，概莫能外，香港再難尋得一片淨土。

日前有調查顯示，多達三分之一港人有移民意願，假難民肆虐導致市民難以「出入平安」，顯然是原因之一。

即使退一萬步說，港府花費大量資源應對假難民問題，先不說用於審核個案、打擊黑工等的人手，假難民的衣食住行、官司費用等，每年也要花費十億元以上公帑，一旦香港對假難民即捕即解，或設置禁閉式難民營，將相關社會成本用於幫助真正有需要的港人身上，能解決多少問題？

Translation:

Settlement of the storm: the Hong Kong

Government should tarnish its reputation no more

If you don't get rid of the grass,
the wind will blow again in spring.
The recurring problem of South Asian fake refugees...

No matter how much the senior officials pontificate and boast about the reduction of the backlog of torture claims, the reality is that the whole territory has been overrun by an army of bogus refugees. From Nanya Village under the Tung Chau Street flyover in Sham Shui Po, to the entire Yau Tsim Mong area, to Tuen Mun, Yuen Long in the New Territories, all of them have been overrun by fake refugees. There is no other way to find a clean slate in Hong Kong.

A few days ago, a survey showed that as many as one-third of Hong Kong people have the intention to emigrate, and it is difficult for people to go out safely because of the rampant fake refugees, which is obvious a reason why people want to emigrate.

Even if we take a step back and say that the Government spends a lot of resources to deal with the problem of bogus refugees, not to mention the manpower used to examine cases, crack down on illegal workers, etc., the cost of clothing, food, housing and transportation for bogus refugees, as well as the cost of legal proceedings, will cost more than \$1 billion of public money every year.

If Hong Kong arrested, discharged fake refugees and set up closed camps for refugees, how many problems can be solved instead by spending the money on helping Hong Kong people in genuine need?

Figure 4.17: Abridged excerpt from pro-Beijing Oriental Daily News

4. Results

is much more dominant in terms of volume even just within the pro-Beijing camp, and linkage between South Asian and “fake refugees” is frequently mentioned by this outlet which may be known, and in some cases accepted, by more readers.

On the other side, non-pro-Beijing newspaper outlets often cover non-refoulement claimants positively either by sharing their personal stories or advocating more sympathy towards this group of vulnerable population. Out of all the positive articles included in the dataset, the excerpt from Apple Daily in figure 4.19 is worth highlighting because it not only sympathetically reports the struggles faced by a former non-refoulement claimant in Hong Kong but also cites expert opinion which criticises the Hong Kong Government’s current asylum seeking regime of lacking transparency and fairness compared to the one in Canada. Such reportage aligns with the former pro-democracy legislators’ arguments that non-refoulement claimants should be treated more humane instead of potentially being indiscriminately detained under the accusation of being “fake refugees” as suggested by the pro-Beijing camp.

4.4.2 Validity of automated sentiment analysis

Aside from the analytic findings, I should also mention the performance of using machine-learning-based methods for sentiment analysis to test H_1 . For starters, a satisfactory f1 score obtained by the tuned XGBoost model as shown in table 4.4 implies that the generated SHAP values are based on a performant model, thereby ensuring the validity of the interpretation in the *Results* section. Accordingly, this analysis demonstrates that natural language processing can be a powerful tool to scale research on larger datasets of text data in Chinese language where it would be very time-consuming to manually analyse every entry.

In addition to the performance of the model, NMF also proves to be a useful tool to summarise the topics of the articles in the dataset without resorting to pre-defined coding schemes. Specifically, the ten topics identified by the NMF model from this dataset are all semantically coherent, and only the **Problem** and **solution** topic has a wider scope of what content can be included than other topics. It is believed that this technique can prove quite useful for summarising the latent topics present in Chinese language corpora in the future, especially when there is no available coding schemes beforehand for classifying the topics of the documents, whether it be for reducing the dimensionality of the dataset or simply discovering the topics mentioned by the documents.

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Original:

假難民嚴重威脅社區治安

劉佩玉認為，目前的酷刑聲請問題亦會對香港的種族共融工作帶來極大負面影響，因為循酷刑聲請來港的部分假難民，在破壞社區治安、環境的同時，亦使在港少數族裔人士的形象大打折扣，而這部分在香港土生土長的少數族裔人士，許多都幾代人以香港為家，認同香港社會的價值觀，是良好市民，一旦他們被標籤化，社區內難免產生芥蒂、誤會，不利於社會和諧。

Translation:

Fake Refugees Seriously Threaten Community Security

Liu Peiyu believes that the current problem of torture claims will have a significant negative impact on Hong Kong's racial integration efforts.

This is because some bogus refugees who came to Hong Kong under torture claims have damaged the law and order and environment of the community.

At the same time, they are also greatly damaging the image of the ethnic minorities in Hong Kong.

Many of these ethnic minorities, who were born and raised in Hong Kong, have called Hong Kong home for several generations, identify with the values of Hong Kong society, and are good citizens. Once they are stigmatized, it is inevitable that the community will have misunderstandings and misconceptions, which is not conducive to social harmony.

Figure 4.18: Abridged excerpt from pro-Beijing Ta Kung Pao

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Original:

大狀：入境處對弱勢缺乏同情

""

【本報訊】曾收留斯諾登的香港三個難民家庭早前曾向港府申請酷刑聲請，全部被拒。其中獲加拿大批准難民身份的Vanessa在港生活近20年，她認為港府將申請庇護者當作香港的垃圾。在港難民沒有工作、沒有金錢、沒有希望和未來，有如生活在地獄之中。協助她的大律師田光譽(Robert Tibbo, 圖)向《蘋果》稱，加拿大的難民篩選制度遠較香港透明和公平，形容香港是「種族主義、歧視、排斥和迫害的世界」。港府審查制度不透明田光譽向《蘋果》表示，Vanessa及其女兒在香港遭受歧視和邊緣化，她不被允許工作，亦沒有足夠的人道主義援助滿足其基本需求，其女兒更因膚色多次遭受種族歧視。

""

Translation:

Barristers: ImmD Lacks Compassion for the Disadvantaged

""

The three refugee families in Hong Kong who had taken in Snowden had applied to the Hong Kong government for torture claims, all of which were rejected.

One of them, Vanessa, who was granted refugee status by Canada, has been living in Hong Kong for nearly 20 years, and she thinks the Hong Kong government treats asylum seekers like trash.

Refugees in Hong Kong have no jobs, no money, no hope or future, and are like living in hell. Robert Tibbo (pictured), the barrister who assisted her, told Apple Daily that Canada's refugee screening system is far more transparent and fair than Hong Kong's. He described Hong Kong as "a world of racism, discrimination, exclusion and persecution.

The Hong Kong government's screening system is not transparent," Tibbo told The Apple. Vanessa and her daughter are discriminated against and marginalized in Hong Kong. She is not allowed to work, there is not enough humanitarian aid to meet her basic needs, and her daughter has suffered repeated racial discrimination because of her skin color.

""

Figure 4.19: Abridged excerpt from pro-democracy Apple Daily

Chapter 5

Conclusion

To recap, I used XGBoost to build a multi-class classification model to investigate whether the sentiments (in the polarities of *negative*, *neutral* and *positive*) of the printed newspaper articles about non-refoulement claimants in Hong Kong may vary according to a newspaper's affiliated political camp in 2019, a year when the city witnessed one of the most large-scale and long-lasting pro-democracy protests since 1997. The SHAP values calculated from the tuned XGBoost model (which obtained a f1 score of 0.7616 in 5-fold cross validation and 0.8814 in the testing set) demonstrate that compared to outlets with other political affiliations, pro-Beijing newspaper outlets are generally *more* likely to publish negative articles containing derogatory or incorrect descriptions about non-refoulement claimants while also being *less* likely to publish positive articles which report on asylum seekers sympathetically and favourably, thereby providing empirical evidence to support H_1 . On the contrary, although the magnitudes in SHAP values are smaller, pro-democracy newspaper outlets are predicted to be *less* likely to publish negative articles and more likely to write positive articles on asylum seekers, whereas neutral outlets are at least less likely to cover non-refoulement claimants in negative light. Some of the topics covered in the news articles are also informative in predicting the sentiments and point to rather clear directions of how a higher presence of a given topic may affect the sentiment of a news article, except for the **Problem** and **solution** topic which by definition has a much wider scope of how it can be mentioned by journalists than other topics discovered by NMF.

The above results suggest that definitions of national identity by political camps may indeed be correlated to their attitudes of how asylum seekers should be treated in society. Specifically, political camp which highlights more on the ethnic dimension of national identity is likely to be

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associated with more negative attitudes towards asylum seekers, whereas political camp which puts more focus on the civic values in defining the national identity will be more likely to be sympathetic towards asylum seekers. In this sense, how national identity is defined may then serve to be a salient factor in affecting how individuals perceive whether their society should be more lenient or stringent towards asylum seekers and how likely individuals may connote this group of vulnerable population. Obviously, the theoretical observations made from the case of Hong Kong should be formally tested in other contexts to see to what extent they are applicable, but the fact that the correlation between definitions of national identity (as reflected by different political camps) and attitudes towards asylum seekers is found in Hong Kong means that the potential influence of this correlation should not be overlooked, especially for studies regarding the attitudes towards asylum seekers in regions where the reach of the central government's political authority is contested.

Moreover, as shown by the performance on the f1 score of the tuned XGBoost model, using machine-learning-based approaches to analyse the sentiments of Chinese-language text can be a viable alternative to analysis done by human coding. This will be quite useful when the document corpora contain a huge volume of text data that will be too resource-intensive to be analysed manually. For instance, the meeting minutes in the Legislative Council which records speeches by legislators about their opinions on bills can be analysed via automated approaches to discover whether the policy positions of different political parties on a given issue could be more segregated based on the pro-Beijing vs pro-Democracy line or the socio-economic left-right dimension until the opposition was effectively barred from political participation in 2020. More possibilities of social sciences research regarding the politics of Hong Kong can be opened up by incorporating techniques from machine learning in general and natural language processing in particular.

5.1 Limitations

Even though the XGBoost model produced results with satisfactory performance, this thesis still suffers a few limitations apart from those mentioned in the *methods* chapter. The most obvious one will be the relatively small size of the dataset. Particularly, observations belonging to the positive polarity class were very rare which inevitably increased the variance of the predictions on this class. There are two potential ways which could have alleviated this limitation. For starters,

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the dataset could extend the covered period to include news articles on non-refoulement claimants from the years 2017 and 2018. A further step can be taken to also include articles from 2016 which can then test if the sentiments of the news articles on asylum seekers in Hong Kong might also be correlated to if a given year had elections that the public could vote. Besides extending the temporal coverage of the dataset, news articles by online news media can also be included via web scrapping. Indeed, this may provide a solution to the lack of sufficient observations of positive articles encountered in the dataset of this thesis, as Ng, Choi, et al. (2021) argue that articles on non-refoulement claimants by online news media from mid-2015 to mid-2016 generally focused more on the humanitarian issues than criminal activities linked to asylum seekers vis-a-vis printed newspapers in the same period. Given that localist news media outlets publish almost exclusively online, incorporating online news articles will also provide an opportunity to see if localist affiliation of media outlets may be correlated to the sentiments of news articles on non-refoulement claimants.

Partly related to the small size of the dataset, more sophisticated models could have been used if there had been more observations. As much as TF-IDF and NMF altogether discovered latent topics in the current dataset that are largely semantically coherent, the deep-learning-based method of *word embeddings* could also be applied on the news articles if more observations were available. Besides reducing the dimensionality of the dataset, another added benefit of word embeddings over simple bag-of-words approaches is that the resulting embedding vector can capture the relationships between words since similar words will share similar encodings after the model's weight are trained with sufficient data (TensorFlow n.d.). Indeed, the ability of word embeddings to capture the relationships between word tokens can help further understand how media outlets from different political camps may use particular terms to depict asylum seekers even in the case of having large datasets where human coding will prove to be difficult.

5.2 Future research directions

While performing sentiment analysis on the news articles about non-refoulement claimants is one way to study how narrative on this group of population in the media may vary by political camps, there are certainly other possibilities to engage with this topic. One of the potential research directions will be using *unsupervised* machine learning techniques such as cluster analysis to see

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how (dis)similar media outlets from different political camps are in reporting on asylum seekers in Hong Kong both *between* and *within* political camps. Essentially, cluster analysis on the news articles can be done by first reducing the dimensionality of the term-document matrix via techniques like NMF (used in this thesis) or word embeddings (should there be enough data) before using clustering algorithms (of which *K-means* is a popular one which assigns each data point into a pre-defined number of clusters k according to the euclidean distance between each data point and the centroid of each cluster).

For the cluster analysis of reportage on the level of *between* political camps, it may be worth investigating whether neutral newspaper outlets cover non-refoulement claimants more similarly to pro-democracy or pro-Beijing outlets. As for the level of *within* camp cluster analysis, it will also be interesting to see if some media outlets within a political camp differ their reportage from their peers despite having the same political affiliation.

5.3 How may the promulgation of the National Security Law affect the public discourse on asylum seekers in Hong Kong?

With the finding that pro-Beijing newspaper outlets are more likely to negatively depict asylum seekers in Hong Kong, the suppression of the opposition camp by the HKSAR Government in both official institutions and the mass media can have profound implications of how non-refoulement claimants may be treated in the future. In short, as the pro-democracy camp has been crippled for being able to influence the public discourse on socio-political issues in Hong Kong by mid-2020 following the promulgation of the National Security Law which tightens political control by the HKSAR Government, it is likely that the narrative on asylum seekers in Hong Kong will be dominated by the pro-Beijing camp in the mass media which, coupled with the Government's increasingly stringent measures against non-refoulement claimants, will likely create more and more hostility against non-refoulement claimants in society.

Starting with the official institutions like the legislature, preliminary evidence suggests that the HKSAR Government is already exploiting the lack of opposition to push forward more stringent measures in cutting the number of non-refoulement claims no matter if they are genuine or not. Just two months after the announcement of pro-democracy legislators of their resignations

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(Cheung and Cheng 2020), the Security Bureau proposed a bill in January 2021 for adding another detention centre of non-refoulement claimants who are alleged to commit crimes and, without clear definition, pose “security risks”, and the more concerning rhetoric from the speech of the head of the Bureau is that he claimed “non-refoulement claims poses a lot of troubles to society” without even differentiating if he was just referring to the “bogus” claims or not besides bashing non-refoulement claimants for being illegal immigrants and costing Hong Kong’s public money for the assessment of their claims (Security Bureau 2021). With virtually no presence of oppositions in the legislature, this bill was overwhelmingly passed in April by pro-Beijing legislators (Oriental Daily News 2021). As the recent 2021 Legislative Council election was concluded after an overhaul of the electoral system which essentially permits candidacy only to the “patriots” loyal to the Beijing and HKSAR Governments (Lau and Yam 2021), the door for the oppositions to advocate alternative political discourses in the legislative has been shut, meaning that the Government will be quite unlikely to face even just verbal oppositions while proposing bills to be passed in the future, including those which further exclude non-refoulement claimants who are already deprived of a substantial amount of societal rights as mentioned by Ng (2020).

While the mass media in Hong Kong used to be where alternative narratives on socio-political issues contrary to the official rhetoric could be found in alternative media as Lee (2018) mentioned, by early 2022 this may not be the case anymore as some pro-democracy media outlets have already been forced to defunct due to increasing political pressure and legal risks. The first outlet forced to shut down was the flagship pro-democracy newspaper *Apple Daily* in June 2021 after the HKSAR Government had frozen its assets under the pretext of the outlet’s violation of the National Security Law (Tan 2021). Just as 2021 ended, the popular pro-democracy online media *Stand News* shut down as well after the Hong Kong police raided its office and arrested senior staff (Ng and Pomfret 2021), followed by the closure of another online pro-democracy news outlets named *Citizen News* days after (BBC 2022). It is probable that more non-pro-Beijing media outlets will be forced to shut down in the future as the HKSAR Government continues its crackdown on political dissidence, thereby causing the pro-Beijing camp to be able to completely dominate how public discourse will be formulated on the mass media. Consequently, the media’s representation of the non-refoulement claimants in Hong Kong will likely be almost unanimously negative without any counter-narrative by alternative media which used to be read by a considerable amount of

5. Conclusion

audience. As the study by Boomgaarden and Vliegenthart (2009) show, more pejorative coverage of refugees by the media may cause the public to be more averse towards this group of vulnerable population after some time, and the effect of negative news coverage may become even more salient when the levels of immigration and asylum seeking applications are perceived to be high. Coupled with mass media's potential to influence how the public may think about the issue of asylum seekers in Hong Kong, the domination of negative stories which constantly portray non-refoulement claimants as criminals or threats to public security will be anything but conducive to more humane treatments and tolerance towards this group of vulnerable population.

As the Government and pro-Beijing media outlets work in consort to push forward the framing of non-refoulement claimants as social problems which should not be welcomed in society and demand stringent measures to be solved efficiently amid the lack of alternative discourse or even actions (such as former legislator Dr. Fernando Cheung's advocacy for the human rights of asylum seekers) from the oppositions, it can be expected that Hong Kong will gradually become a city that is more and more unfavourable towards individuals who are forced to flee from their home countries due to threats of tortures. Worse, *CY Leung's* suggestion of quitting the UNCAT may even become true in the future, thereby further deteriorating the human rights situation in Hong Kong which has already been concerned globally as the Government cracks down the oppositions (United Nations 2021).

Appendix: The Echoes of the Code

The goal of this appendix is to echo the code you used in your thesis for a greater sense of transparency and replicability of your research. Note that `ref.labels` can be set to any label. Hence, you can filter the code you want replicated in the appendix by setting labels to the desired code chunks in the various chapters. See this excellent resource for more information.

This might be particularly useful when you perform model selection to output intermediary steps here instead of in the code to avoid cluttering your report.

Appendix: The Echoes of the Code redux

Add as many appendices as you like.

Below is the codes for setting up the hyper-parameter tuning grid for the XGBoost model. Note that the results from hyperopt may differ due to the stochastic nature of the search space defined for Bayesian Optimisation.

```
from hyperopt import fmin, hp, tpe, Trials
from sklearn.metrics import make_scorer, f1_score
import xgboost as xgb

# Setting up the hyper-parameter grid
xgb_space = {
    "n_estimators": hp.quniform("n_estimators", 10, 50, 5),
    "max_depth": hp.quniform("max_depth", 2, 8, 1),
    "learning_rate": hp.quniform("learning_rate", 0.01, 0.5, 0.01),
    "gamma": hp.quniform("gamma", 0.1, 10, 0.1),
    "min_child_weight": hp.quniform("min_child_weight", 1, 10, 1),
    "subsample": hp.quniform("subsample", 0.5, 0.9, 0.1),
    "colsample_bytree": hp.quniform("colsample_bytree", 0.5, 0.9, 0.1),
    "reg_lambda": hp.quniform("reg_lambda", 1, 100, 1)
}

# Defining the objective function
```

Appendix

```
def xgb_objective(params):

    xgboost_clf = xgb.XGBClassifier(objective="multi:softmax",

                                    eval_metric="mlogloss",

                                    random_state=1,

                                    use_label_encoder=False)

    xgb_params = {

        "n_estimators": int(params["n_estimators"]),

        "max_depth": int(params["max_depth"]),

        "learning_rate": params["learning_rate"],

        "gamma": params["gamma"],

        "min_child_weight": int(params["min_child_weight"]),

        "subsample": params["subsample"],

        "colsample_bytree": params["colsample_bytree"],

        "reg_lambda": params["reg_lambda"]

    }

    loss = 1 - np.mean(cross_val_score(xgboost_clf.set_params(**xgb_params), X_train_final, y_train, cv=

    return loss

# Searching for optimal hyper-parameters

xgb_trials = Trials()

best_xgb_params = fmin(xgb_objective, xgb_space, algo=tpe.suggest, max_evals=1000, rstate=np.random.se

# from sklearn.model_selection import cross_val_score, StratifiedKFold

# from sklearn.metrics import classification_report

# Utility function for evaluating the model's performance in cross validation and test set in terms of

# def evaluate_model_f1(model, model_name: str, cv=five_fold_cv, X_train=X_train_final, X_test=X_test_

#     y_pred = model.predict(X_test)

#     cv_f1_score = np.mean(cross_val_score(model, X_train, y_train, cv=cv, scoring=make_scorer(f1_score

#     test_f1_score = f1_score(y_test, y_pred, average="macro")
```

References

```
# return {"5-fold cv f1 score": cv_f1_score, "Test set f1 score": test_f1_score}

# Setting the appropriate data types of some hyper-parameters
best_xgb_params["n_estimators"] = int(best_xgb_params["n_estimators"])
best_xgb_params["max_depth"] = int(best_xgb_params["max_depth"])

# Fitting the model
xgb_tuned = xgb.XGBClassifier(objective="multi:softprob",
                              eval_metric="mlogloss",
                              random_state=1,
                              use_label_encoder=False).set_params(**best_xgb_params)

_ = xgb_tuned.fit(X_train_final,
                  y_train,
                  sample_weight=xgb_sample_weight,
                  eval_set=[(X_test_final, y_test)],
                  early_stopping_rounds=5,
                  verbose=0)

# Evaluating the tuned model
print(evaluate_model_f1(xgb_tuned, "Tuned xgboost"))
print(classification_report(y_test, xgb_tuned.predict(X_test_final)))

# To save the model locally. un-comment the below lines of code
import pickle
pickle.dump(xgb_tuned, open("xgb_clf_tuned_II.pkl", "wb"))
```

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