

1 **The Potential Benefits of Location Specific Biometeorological Indexes**

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3
4 **Abstract**

5
6 It is becoming popular to use biometeorological indexes to study the effects of
7 weather on human health. Most of the biometeorological indexes were developed decades
8 ago and only applicable to certain locations because of different climate types. Merely
9 using standard biometeorological indexes to replace typical weather factors in
10 biometeorological studies of different locations may not be an ideal research direction.

11 This research is aimed at assessing the difference of statistical power between using
12 standard biometeorological indexes and typical weather factors on describing the effects
13 of extreme weather conditions on daily ambulance demands in Hong Kong. Results
14 showed that Net Effective Temperature and Apparent Temperature did not perform better
15 than typical weather factors in describing daily ambulance demands in this study. The
16 maximum adj-R² improvement was only 0.08, whereas the maximum adj-R² deterioration
17 was 0.07.

18 In this study, biometeorological indexes did not perform better than typical weather
19 factors, possibly due to the differences of built environments and lifestyles in different
20 locations and eras. Regarding built environments, the original parameters for calculating
21 the index values may not be applicable to Hong Kong that buildings in Hong Kong are
22 extremely dense and most are equipped with air-conditioners. Regarding lifestyles, the
23 parameters, which were set decades ago, may be outdated and not suitable to modern
24 lifestyles that using hand-held electrical fans on the street to help reduce heat stress are
25 popular. Hence, it is ideal to have tailor-made updated location specific
26 biometeorological indexes to study the effects of weather on human health.

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28 **Keywords:** ambulance; biometeorological index; health; weather

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Introduction

The issue of climate change has long been a popular discussion topic among scholars and the public. Evidence suggests that the effects of global warming are one of the major problems faced by mankind. This inspired many researchers to study the effects of extreme weather conditions on different aspects of health outcomes, such as heat related illnesses (Sugg et al. 2016), suicide (Page et al. 2007), and ambulance demand (Wong et al. 2015a). A majority of the earlier studies used typical weather variables (e.g. average temperature, relative humidity, etc.) to quantify weather conditions (Ohshige et al. 2005; Liang et al. 2009; Wong and Lai 2010; Wong et al. 2015b). Most found that extreme weather conditions have a significant impact on human health. As such studies are very popular, researchers start to use biometeorological indexes such as Net Effective Temperature (NET) (Hentschel 1986) and Apparent Temperature (AT) (Steadman 1984) to conduct further analysis. It is believed that using biometeorological indexes to assess the impacts of extreme weather conditions on human health is better than using typical weather factors. This is because biometeorological indexes are generally developed based on theoretical stands. Moreover, they are composed of more than one weather factor that can better explain non-linear interaction effects between weather factors. For example, during windy and dry days, people may have a higher tolerance for high temperatures, whereas they may feel uncomfortable on wet and windless days. In fact, The World Meteorological Organization and World Health Organization also recommend using biometeorological indexes to evaluate the impacts of heat stress on human health (McGregor et al. 2010).

Studies using biometeorological indexes are now very popular (Chung et al. 2009; Wichmann et al. 2011; Xu et al. 2013). Although many related studies reported that significant relationships between weather and health were found, it is questionable if the relationships obtained by correlating biometeorological indexes and health outcomes can always better reflect the real situations compared to typical weather factors. For the case

1 when biometeorological indexes depend on the factor of air temperature heavily, it is
2 common that index values are usually in the same proportion as air temperature values.
3 Merely adopting biometeorological indexes may result in obtaining a weaker weather-
4 health relationship if the indexes chosen were not suitable. For example, it is common for
5 researchers to use outdoor weather factors measured by weather stations to correlate with
6 health outcomes. However, this approach is questionable as people in metropolitan area
7 generally spend more than 90% of their time indoors, while indoor and outdoor climate
8 are not always strongly correlated (Nguyen et al. 2013). In Hong Kong, the built
9 environments are very different from Western countries as buildings are extremely dense
10 and most are equipped with air-conditioners. Moreover, it is well known that indoor
11 temperature in Hong Kong is commonly maintained at a very low level (e.g. below
12 20°C). Even in the outdoor environment, it is popular for people to use hand-held
13 electrical fans on the street to help reduce heat stress, which was impossible decades ago.
14 Hence, people in Hong Kong are less likely to be affected by outdoor weather conditions,
15 which implies that standard biometeorological indexes are less useful. In particular, on
16 exceptionally hot days, street sleepers may just move to and stay in shopping malls or
17 McDonald's 24-hour stores to enjoy the air conditioned environment, which sparked the
18 term “McRefugee.” It is questionable if standardized and commonly used
19 biometeorological indexes such as NET and AT are suitable for use in metropolitan
20 regions such as Hong Kong. In this connection, this study seeks to compare the
21 performance of applying typical weather factors and biometeorological indexes to
22 describe daily ambulance demand in Hong Kong.

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24 **Materials and Methods**

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26 **Data**

27 The data used in this study is secondary time-series data generated from the study on
28 the relationship between typical weather factors and daily ambulance demands by Wong
29 (2012). The time-series data includes daily ambulance demands in Hong Kong by
30 patients' age, gender, triage level, hospital admission status, and economic status from
31 May 2006 to April 2009. Although it is worth to know the time spent outdoors to enrich

1 the study, the use of hospital record limited the availability of such information. In
 2 addition, hourly temperature, relative humidity, and wind speed values based on a time
 3 measurements (e.g. at 12:00, 13:00, 24:00, etc) measured by the Hong Kong Observatory
 4 located in the central of Hong Kong were used to calculate the daily average NET and AT
 5 values of the same period. Daily average values NET and AT were chosen because they
 6 can cater for the analysis of both summer and winter period. Moreover, the choice in this
 7 study is also consistent with the choice of Wong (2012) which make the comparison more
 8 convenient. As the total area of Hong Kong is only 2755 km², the single weather station
 9 measurement is representative to the whole Hong Kong territory and adopted by different
 10 similar studies (Wong 2012; Wong et al. 2015b).

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12 The equations of NET and AT are listed as below:

$$\text{NET} = 37 - \frac{37 - T}{0.68 - 0.0014\text{RH} + \frac{1}{(1.76 + 1.4v^{0.75})}} - 0.29T(1 - 0.01\text{RH})$$

$$\text{AT} = -2.7 + 1.04T + 2e - 0.65v$$

13 where T is temperature, RH is relative humidity, v is wind speed, and e is water
 14 pressure defined as $e = \left(\frac{\text{RH}}{100}\right) \times 6.10 \times \exp\left(17.27 \times \frac{T}{237.7 + T}\right)$. Detailed information about the
 15 original dataset can be found in Wong (2012).

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17 Data analysis

18 Extreme weather conditions may not have immediate effects on daily ambulance
 19 demands, so the optimal number of lag days was first being identified through correlating
 20 the NET and AT time-series data with the daily ambulance demands of 1) all people in
 21 Hong Kong and 2) only people aged above 65. Each ambulance demand time-series data
 22 (dependent variable) was then regressed on the NET and AT time-series data
 23 (independent variable) respectively with the lag effects being adjusted. The adj-R²
 24 obtained from the regression models were compared to the adj-R² of the model composed
 25 of the factors of air temperature (i.e. average temperature, average temperature square,
 26 and sum of average temperature difference) obtained in Wong's study (2012) to find out
 27 if biometeorological indexes could better describe daily ambulance demands in Hong

1 Kong. Although Wong's study included models with other weather factors such as
2 relative humidity, pressure, and cloud, they would only be considered if the
3 biometeorological index outperformed the model with air temperature related factors
4 only. All the data preprocessing steps applied in this study were the same as those applied
5 in Wong's study (2012) so that comparison of the regression results can be made.

6 7 **Results**

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9 According to Table 1, the adj-R² obtained from biometeorological indexes were
10 similar to those obtained from typical weather factors. Although some of the regression
11 models constructed using biometeorological indexes had a better adj-R² value, the
12 improvements were insignificant (maximum adj-R² improvement =0.08). In some cases,
13 biometeorological indexes even performed worse than typical weather factors (maximum
14 adj-R²deterioration =0.07).

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16 <please insert Table 1 here>

17 18 **Discussion**

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20 In this study, biometeorological indexes did not perform significantly better than
21 typical weather factors, and sometimes performed slightly worse. This is consistent with
22 the results of an Australian, which also showed that the capability of modeling outcomes
23 of heat-related mortality using average temperature and different biometeorological
24 indexes were similar (Vaneckova et al. 2011). Although biometeorological indexes have
25 the advantage of having a single numerical value to describe different weather conditions,
26 which is useful when a threshold value is required to develop a warning system, they may
27 not have enough power to describe different health outcomes even if the outcome is
28 sensitive to extreme weather conditions. For this study, it is possible that the
29 biometeorological indexes were lowered because their parameters might not be suitable
30 for the situation in Hong Kong. In fact, Effective Temperature (ET) was first introduced
31 by Houghton and Yaglou (1923), and Missenard (1933) further developed the

1 mathematical formula. NET was named by Li and Chan (2000) through adapting the
2 Missenard formula (Blazejczyk et al. 2012), while AT was created in 1984 (Steadman
3 1984). We mentioned earlier, the modern built environments are quite different from that
4 of decades ago, the changes may affect street air ventilation and resulted in lower wind
5 speed and higher air temperature. As in metropolitan areas, outdoor weather data were
6 typically measured on building roof top and people typically spend 90% of the time
7 indoor, outdoor weather measurements may not be able to reflect the environmental
8 conditions that people is facing. Hence, it was not surprising that the biometeorological
9 indexes did not outperform typical weather factors, it is also questionable if
10 biometeorological indexes can be applied in different places of the world without
11 recalibrating their parameters or redefining threshold values for issuing location specific
12 warning signals. Ideally, it is better for each location to have its own biometeorological
13 index calculated using tailor made formula based on specific health outcomes. For this
14 reason, the Hong Kong Observatory has already attempted to develop the Hong Kong
15 Heat Index (HKHI) for use in Hong Kong based on hospitalization rate (Lee et al. 2016),
16 although a significant number of weather and health studies chose to use standard
17 biometeorological indexes without any adjustment.

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19 To conclude, it is ideal to redevelop location specific biometeorological indexes or
20 recalibrate NET and AT so that the new indexes can be applied in different regions and
21 the distinctive built environments and lifestyles can be accounted for. One of the ways to
22 achieve this is through regressing important health outcomes on different weather factors
23 and let the data to decide the optimum factors with the help of corresponding subject
24 knowledge. In fact, the development of HKHI is already a good example on developing a
25 tailor made biometeorological index for local use, although indoor climate was not
26 considered

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28 When such a recalibrated or tailor-made biometeorological index is not available, it
29 is suggested to include typical weather factors as a control in studies so the performance
30 of biometeorological indexes can be assessed.

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3 Administrative Region for access to data records used in the present study: Hospital
4 Authority and Hong Kong Observatory.

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6 **Conflict of Interest**

7 The authors declare that they have no conflict of interest.

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Table 1 The difference between using biometeorological indexes and typical weather factors*** in describing daily ambulance demand

		Typical weather factor*	NET*		AT*	
		adj-R ²	adj-R ²	improvement	adj-R ²	improvement
Age	0-14	n.a.	n.a.	n.a.	n.a.	n.a.
	15-34	0.15	0.15	0.00	0.16	0.01
	35-64	0.24	0.25	0.01	0.30	0.06
	65+	0.74	0.69	-0.05	0.67	-0.07
gender	Male	0.46	0.40	-0.06	0.42	-0.04
	Female	0.42	0.43	0.01	0.44	0.02
Triage Level	1	0.62	0.57	-0.05	0.56	-0.06
	2	0.50	0.46	-0.04	0.47	-0.03
	3	0.61	0.57	-0.04	0.55	-0.06
	4	0.15	0.17	0.02	0.23	0.08
	5	n.a.	n.a.	n.a.	n.a.	n.a.
Hospitalization status	Admit	0.70	0.66	-0.04	0.63	-0.07
	Not admit	0.14	0.14	0.00	0.21	0.07
Economic Status	CSSA**	0.51	0.48	-0.04	0.47	-0.04
	Non-CSSA	0.40	0.38	-0.02	0.40	0.00
Overall		0.49	0.46	-0.03	0.48	-0.01

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*4-day time-lag data; **CSSA: Comprehensive Social Security Assistance;*** Typical weather factors includes temperature, average temperature square, and sum of average temperature difference (Wong 2012).