Quantitative exponential modelling of copycat suicides: association with mass media effect in South Korea

S. Suh^{1,2†}, Y. Chang^{3†} and N. Kim^{3*}

Background. There is ample evidence media reporting of celebrity suicides increases copycat suicides. This study had three aims: (a) to quantitatively examine copycat suicides with exponential modelling that predicts the copycat suicide effect of South Korean celebrity suicides; (b) to investigate the association between media effect and subsequent suicides following celebrity deaths; and (c) to investigate the extent in which media influences the increase and rate of decline of copycat suicides following a celebrity suicide.

Methods. All suicides during 1991–2010 in South Korea were included in this study utilising a nationwide database. Fifteen celebrities were selected based on the frequency of media reports following 1 week after their suicide. The media effect was obtained through the Korean Integrated Newspaper Database System. Exponential curve fits and correlation analyses investigated the quantitative effect of copycat suicides.

Results. After controlling for baseline number of average suicides, there was a marked increase in the number of suicides following each celebrity suicides, which followed an exponential model. There was a significant correlation between the total number of copycat suicides and number of media following the celebrity suicide (r = 0.74, p < 0.01). There were weak-to-moderate correlations between the amplitude of increase in suicides (r = 0.45, p = 0.09) and rate of decline (r = 0.38, p = 0.16) with the total number of media coverage.

Conclusions. Copycat suicides following celebrity suicides follow exponential modelling. Additionally, there is a strong media effect between the number of media reports following the days after celebrity suicides and subsequent copycat suicides. This may also be associated with the amplitude and rate of decline of copycat suicides. This suggests that improving media reporting and implementing preventative interventions for vulnerable populations may be important.

Received 23 October 2013; Revised 4 December 2013; Accepted 9 December 2013; First published online 4 February 2014

Key words: Celebrity suicide, copycat suicide, media effect, epidemiology.

Introduction

Suicide is becoming an increasing worldwide public health problem, with nearly 1 million people dying from suicide annually (Word Health Organization, 2008). Recently, South Korea has shown alarmingly increased suicide rates, with 31.2 suicide deaths per 100 000 people in 2011, ranking the highest rate among Organisation for Economic Co-operation and Development (OECD) nations and approximately

three times the average of advanced industrialised nations (Hvistendahl, 2013).

While suicide is a complex phenomenon, recent evidence has found an increase in suicide rates following a celebrity suicide. Frequently called the Werther effect, copycat suicide is characterised by the desire to imitate suicide after exposure to another individual's suicide, which is often a well-known figure whose death is widely publicised. Studies have shown that national suicide rates spur an increase in mass copycat suicides immediately following the suicides of entertainment celebrities, and to a lesser extent political figures (Phillips, 1974; Stack, 1987, 2000; Niederkrotenthaler et al. 2012). One study by Jeong et al. (2012) investigated the effect of five celebrity suicides on copycat suicides, indexed by suicide attempt visits to the emergency department in South Korea. Their study found that emergency department

¹ Korea University Ansan Hospital, Human Genome Institute, Ansan, South Korea

² Department of Psychiatry, Stanford University Medical Center, Stanford, CA, USA

Department of Radiology, Asan Medical Center, University of Ulsan College of Medicine, 88, Olympic-ro 43-gil, Seoul 138-736, South Korea

^{*}Address for correspondence: Dr N. Kim, Department of Radiology and Research Institute of Radiology, Asan Medical Center, University of Ulsan College of Medicine 88, Olympic-ro 43-gil, Seoul 138-736, South Korea.

⁽Email: namkugkim@gmail.com)

[†]These authors contributed equally to the manuscript as co-first authors.

visits for suicide attempts or self-injury increased significantly following the announcements of celebrity suicides. Fu & Chan (2013) pooled ten studies with a total of 98 suicides by celebrities and found a pooled estimate of change in suicide rates (suicides per 100 000 population) of 0.26 in the month following a celebrity suicide. One recent study by Fu & Chan (2013) utilised a time-series analysis using ARIMA transfer function models to investigate the impact of 13 celebrity suicides on subsequent suicide rates in South Korea. In their study, 3 out of 11 cases found a significant increase in subsequent suicide rates, after adjusting for seasonality, secular trends and unemployment rates. The authors conclude that non-significance cases may largely be due to contextual factors, such as media coverage of celebrity suicides.

Researchers have long speculated mass media coverage as a driver in the increase of mass suicide following a celebrity suicide, with suicide-related information assumed to be disseminated by newspapers, magazines, television (TV) and radio. Previous studies have found that the increase in suicides is proportional to the amount of media coverage of the suicide. Stack (2003) conducted a meta-analysis of 293 findings from 42 studies on the impact of highly publicised celebrity suicides in the media on the number of copycat suicides. He found that studies measuring the effect of either an entertainment or political celebrity suicide story were 14.3 times more likely to find a copycat effect compared with other studies. Similar increases in suicide rates following a highly publicised suicide of a celebrity have been observed worldwide, including Korea (Fu & Yip, 2009).

Despite the evidence of the copycat suicide phenomenon, there is limited information on the actual amount and length of impact on actual suicides following a celebrity suicide. Additionally, there is also limited knowledge on the quantitative impact of mass media coverage on the amount and length of impact on actual suicides following a celebrity suicide. Recently, Yang et al. (2013) investigated the association of suicide deaths with suicide news using longitudinal and spatial analysis. Their results indicated that media reporting of suicides was strongly associated with increased suicide deaths following a celebrity suicide, and slightly lagged behind the suicide deaths for approximately 1 month in the absence of other celebrity deaths. Another study by Fu & Yip (2009) estimated the risk for suicide deaths in three Asian celebrities in Hong Kong, Taiwan and South Korea using a meta-analytic approach. Their results found the highest risk in the first week following celebrity suicides after adjusting for secular trends (calendar year), seasonality, economic situation and temporal autocorrelation. However, there are no studies which

have attempted to fit the copycat suicide phenomenon using exponential modelling that predicts the actual amount and length of impact on actual suicides following a celebrity suicide, and the extent to which mass media influences the increase and subsequent decline of copycat suicides following a celebrity suicide.

The present study has three aims: (a) to examine suicide modelling with exponential curve that predicts the copycat suicide effect of each celebrity suicide; (b) to investigate the association between media effect (both newspaper and TV) and subsequent suicides following celebrity deaths; and (c) to investigate the extent to which mass media influences the increase (amplitude or *A*) and the rate of decline (*K*) in the model for copycat suicides following a celebrity suicide by correlation analysis.

Methods

Suicide data

The present study utilised nationwide data from Korean Statistical Information Service (KOSIS, http://kosis.kr) in South Korea from 1991 to 2010 on all suicide deaths in South Korea (KOSIS). This database contains sociodemographic information, and dates and method of suicide classified according to the International Classification of Disease (ICD) ninth version (suicide ICD: X60–X84). Computerised searches for suicidal death with in-house software, developed by Matlab (MathWorks Inc, Natick, MA, USA), were performed.

Celebrity data

First, incidents of death by suicide of Korean celebrities were identified. These figures included entertainment, political or economical celebrity figures. Based on the most widely used search engine in Korea (Naver, http://www.naver.com), all celebrities that had committed suicide between 1990 and 2010 were retrieved by keyword searches for 'celebrity suicide, actor/ actress suicide, politician suicide, singer's suicide or star suicide'. A total of 30 celebrities were identified. Among these 30 celebrities, we did additional searches of the number of articles that were published by the top three newspapers in Korea (Chosun Ilbo, Chungang Ilbo and Donga Ilbo), which were selected based on the highest circulation rates determined by the Korea Press Foundation, during the first 7 days after the celebrity had committed suicide. Among these 30 celebrities, the top 15 celebrities with highest number of media reports were selected for the study. The selected celebrities for analysis included three politicians, 11 entertainment celebrities and one economic

Table 1. Name, demographics and date of death of selected celebrities

Celebrity case	Celebrity name	Age at time of death	Sex	Date of death	Occupation
Celebrity 1	Moohyun Roh	62	Male	2009/05/23	Former president
Celebrity 2	Jinsil Choi	39	Female	2008/10/02	Actress
Celebrity 3	Jaehwan Ahn	36	Male	2008/09/08	Actor
Celebrity 4	Jinyoung Choi	39	Male	2010/03/29	Actor
Celebrity 5	Yongha Park	32	Male	2010/06/30	Actor
Celebrity 6	Monghun Chung	54	Male	2003/08/04	Conglomerate
Celebrity 7	Jisun Song	29	Female	2011/05/23	Anchor woman
Celebrity 8	Dongha Chae	29	Male	2011/05/27	Singer
Celebrity 9	Jayeon Jang	29	Female	2009/03/07	Actress
Celebrity 10	Dabin Jeong	26	Female	2007/02/10	Actress
Celebrity 11	Sooil Lee	63	Male	2005/11/20	Politician
Celebrity 12	Eunju Lee	24	Female	2005/02/22	Actress
Celebrity 13	Chaewon Jang	26	Female	2008/10/03	Entertainer
Celebrity 14	Sangyeong Ahn	65	Male	2004/02/05	Politician
Celebrity 15	Seungyeon Woo	25	Female	2009/04/27	Actress

figure (see Table 1). Their names were ordered by the number of media search results and for simplicity denoted as 'Celebrity 1, Celebrity 2, etc.' as follows: Moo-hyun Roh (Celebrity 1), Jinshil Choi (Celebrity 2), Jaehwan Ahn (Celebrity 3), Jinyoung Choi (Celebrity 4), Yongha Park (Celebrity 5), Mong-heon Jeong (Celebrity 6), Jisun Song (Celebrity 7), Dongha Chae (Celebrity 8), Jayeon Jang (Celebrity 9), Dabin Jung (Celebrity 10), Sooil Lee (Celebrity 11), Eunju Lee (Celebrity 12), Chaewon Jang (Celebrity 13), Sangyeong Ahn (Celebrity 14) and Seungyeon Woo (Celebrity 15). For these celebrities, age at the time of death ranged from 24 to 65 years and 53% were male. Demographic information of the celebrities can be found in Table 1.

Media effect

The number of media reports following each celebrity's suicide was retrieved from a media portal, namely the Korean Integrated Newspaper Database System (KINDS, www.kinds.or.kr), which was developed by the Korea Press Foundation. This comprehensive full-text Korean news database has included articles in national and local newspapers, Internet articles and magazines, as well as TV reports since 1990. The name of each celebrity was entered into the portal, along with each individual date following the celebrity's suicide. The number of media reports for newspapers and TV were retrieved separately for analysis.

Model fit and statistical analyses

To model the copycat suicide of celebrities in South Korea, we adopted an exponential curve for the number of copycat suicides following a celebrity suicide as in (1).

$$f(x) = A \cdot \exp(-K \cdot x),\tag{1}$$

where A and K are model parameters, x is the observed day from a starting day, and f(x) is the number of suicides. The resulting parameter estimates are summarised in Table 2.

In the model fitting, we assumed that the number of copycat suicides following each celebrity suicide takes an exponential shape with a specific starting day and duration, which are unique for each celebrity. The decision to consider different starting days and durations in modelling copycat suicides was mainly because each celebrity suicide has a different property until the death becomes made public. For example, in some cases people did not know whether the deaths of celebrities were suicides until wills or police reports were publicised, whereas in other cases they were concluded as suicides instantly due to apparent evidence. We observed the pattern of the number of suicides following a celebrity suicide, and then determined the reference day (shown in Table 2), as the starting day of model fitting to copycat suicides within 2 weeks from the celebrity suicide. In a similar way, the duration considered in a model fit was determined by closely observing the movement of the number of suicides following a celebrity suicide. Thus, we set the duration for the model fit as the period between the aforementioned starting day, and the day when the number of copycat suicides no longer seems to follow a single exponential curve, which we labelled as the duration in which the exponential model was valid (Table 2). The maximum duration was limited to 20 days. Additionally, we also subtracted the

 Table 2. Exponential modelling of copycat suicides following 14 celebrity suicides in South Korea

Celebrity	Average suicides 2 weeks prior to reference day	Reference day	Duration	Α	K	Adjusted R ²	RMSE	<i>p</i> -value	Selection of model
Celebrity 1	49.53	+3	12	54.29	0.59	0.55	6.64	0.69	Yes
Celebrity 2	37.80	+0	20	41.45	0.05	0.40	8.25	0.41	Yes
Celebrity 3	34.27	+6	6	25.47	0.49	0.15	10.91	0.03	No
Celebrity 4	36.07	+6	7	38.34	0.17	0.33	9.75	0.15	Yes
Celebrity 5	44.93	+1	16	26.40	0.12	0.38	7.63	0.41	Yes
Celebrity 6	35.87	+0	20	16.70	0.11	0.40	4.93	0.93	Yes
Celebrity 7	51.73	+0	6	18.91	0.47	0.14	9.29	0.27	Yes
Celebrity 8	54.73	+3	7	44.24	0.52	0.32	13.70	0.01	No
Celebrity 9	37.33	+0	20	8.62	0.00	0.00	8.05	0.11	Yes
Celebrity 10	32.53	+0	9	18.45	0.10	0.04	8.08	0.24	Yes
Celebrity 11	25.60	+7	7	19.62	0.26	0.43	5.04	0.65	Yes
Celebrity 12	23.87	+8	11	33.36	0.08	0.19	9.34	0.04	No
Celebrity 13	36.80	+3	12	40.25	0.09	0.39	8.16	0.50	Yes
Celebrity 14	24.13	+13	8	20.99	0.16	0.35	4.76	0.81	Yes
Celebrity 15	45.60	0	6	11.40	0.32	0.33	3.50	0.97	Yes

Celebrity 1, Moohyun Roh; Celebrity 2, Jinsil Choi; Celebrity 3, Jaehwan Ahn; Celebrity 4, Jinyoung Choi; Celebrity 5, Yongha Park; Celebrity 6, Monghun Chung; Celebrity 7, Jisun Song; Celebrity 8, Dongha Chae; Celebrity 9, Jayeon Jang; Celebrity 10, Dabin Jeong; Celebrity 11, Sooil Lee; Celebrity 12, Eunju Lee; Celebrity 13, Chaewon Jang; Celebrity 14, Sangyeong Ahn; Celebrity 15, Seungyeon Woo.

average number of suicides for 2 weeks prior to the celebrity suicide from the number of total suicides following the celebrity suicide, and considered this normalised data in order to minimise the influence by seasonal effect. The start days of modelling from the suicide day and the average numbers of suicides for 2 weeks before the celebrity deaths appear in Table 2.

To validate exponential curve modelling of copycat suicide, χ^2 tests were performed on each celebrity suicide based on the following statistic χ^2 :

$$\chi^{2} = \sum_{i=1}^{n} \frac{\left(x_{i} - e_{i}\right)^{2}}{e_{i}},$$
 (2)

where x_i and e_i are the observed value and estimated value on the *i*th day (i=1, 2, ..., n) from a starting day for each celebrity based on an exponential model. From the statistics in (2), the corresponding p-values were computed with a degree of freedom set to n-1. The resulting p-values were summarised in Table 2.

To examine the media effect on copycat suicide, two separate correlational analyses were conducted for each celebrity. The first analysis examined the association between the number of newspaper reports following the celebrity suicide and number of suicide incidences. The second analysis examined the association between the number of TV reports 30 days following the celebrity suicide and number of suicide incidences. All correlational

analyses used Pearson's correlation coefficient. In the statistical analysis, all tests were based on significance level set at 0.05 and two-sided tests.

Results

Exponential modelling curve

From the model validation with χ^2 tests, exponential model fits were statistically accepted in all cases except Celebrities 3, 8 and 12, as seen in Table 2. Among the cases where exponential curves were statistically acceptable, the adjusted coefficients of determination (R^2) ranged from 4 to 55%, except for Celebrity 9. According to Table 2, Celebrity 1 showed the highest R^2 . The actual copycat suicides and the exponentially fitted model for Celebrity 1 appear in Fig. 1.

Correlation between media effect and suicide incidence

Correlational analysis between the number of media (newspaper, TV) and that of suicide incidents 30 days after each celebrity's suicide was conducted (see Table 3). There was a significant correlation between the number of newspaper reports and that of suicide incidents for Celebrity 1 (r=0.71, p=0.01), Celebrity 2 (r=0.71, p<0.01), Celebrity 5 (r=0.61, p=0.01),

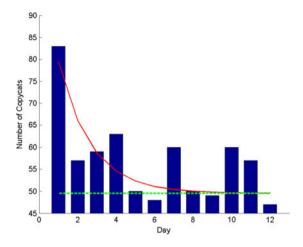


Fig. 1. Exponential model of Celebrity 1. *The red line is the fit curve, green dotted line indicates 49.53, which is the average suicides 2 weeks prior to reference day).

Celebrity 9 (r=0.44, p=0.05), Celebrity 11 (r=-0.92, p<0.01) and Celebrity 12 (r=0.61, p=0.04), where all the correlations are positive except for Celebrity 11. There was also a significant correlation between the number of TV reports and suicide incidents for Celebrity 1 (r=0.58, p=0.05), Celebrity 2 (r=0.76, p<0.01), Celebrity 6 (r=0.49, p=0.03), Celebrity 13 (r=0.81, p<0.01) and Celebrity 15 (r=0.84, p=0.04).

In an overall analysis, the number of copycat suicides during the unique duration of each celebrity based on the exponential fitting analysis were pooled together and correlated with the total number of media. There was a significant correlation between the total number of copycat suicides and the total number of media (r = 0.74, p < 0.01) for 14 celebrities (Celebrities 2–15). The data for Celebrity 1, the former President Roh, was excluded in the analysis because of a high number of political articles produced unrelated to his suicide following his death, which we determined could result in a biased correlation. This result is depicted in Fig. 2.

Correlation between media effect and A, K of copycat suicides

The average amplitude (A) of all the celebrities combined was 29.90 (± 13.37), and the average rate of decline (K) was 0.23 (± 0.20). There was a weak positive correlation between the average amplitude of increase in copycat suicides (A; r = 0.38, p = 0.16) and rate of decline (K; r = 0.45, p = 0.09) of copycat suicides with the total number of media. Similar patterns were observed when newspaper reports and TV were analysed separately with copycat suicides (see Table 4).

Table 3. Correlation between media effect (newspaper, TV) and copycat suicides (number of newspaper and TV reports submitted within 30 days following each celebrity's suicide)

Celebrity	Newspaper (M)	TV (M)	News		TV	
			r-value	<i>p</i> -value	r-value	<i>p</i> -value
Celebrity 1	120.66	181.8	0.71	0.01	0.58	0.05
Celebrity 2	23.73	12.6	0.71	0.00	0.76	0.00
Celebrity 3	9.26	6.3	0.28	0.59	0.33	0.53
Celebrity 4	2.06	4.86	0.40	0.37	0.35	0.44
Celebrity 5	4.03	3.66	0.61	0.01	0.46	0.07
Celebrity 6	34.73	6.76	0.41	0.07	0.49	0.03
Celebrity 7	2.33	2.03	0.63	0.18	0.65	0.16
Celebrity 8	0.96	1.1	0.05	0.92	0.58	0.17
Celebrity 9	19.63	56.63	0.44	0.05	0.29	0.21
Celebrity 10	1.66	0.16	0.05	0.91	0.20	0.61
Celebrity 11	4.3	0.63	-0.92	0.00	0.18	0.70
Celebrity 12	4.73	0.83	0.61	0.04	0.47	0.14
Celebrity 13	0.6	0.2	-0.04	0.89	0.81	0.00
Celebrity 14	5.56	0.36	0.34	0.41	*	*
Celebrity 15	0.2	1.16	-0.08	0.89	0.84	0.04

^{*}No TV reports were submitted.

Celebrity 1, Moohyun Roh; Celebrity 2, Jinsil Choi; Celebrity 3, Jaehwan Ahn; Celebrity 4, Jinyoung Choi; Celebrity 5, Yongha Park; Celebrity 6, Monghun Chung; Celebrity 7, Jisun Song; Celebrity 8, Dongha Chae; Celebrity 9, Jayeon Jang; Celebrity 10, Dabin Jeong; Celebrity 11, Sooil Lee; Celebrity 12, Eunju Lee; Celebrity 13, Chaewon Jang; Celebrity 14, Sangyeong Ahn; Celebrity 15, Seungyeon Woo.

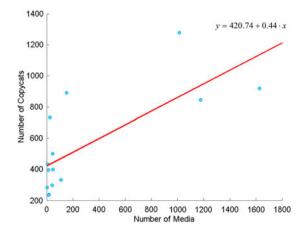


Fig. 2. Scatter plot of the number of total media and the number of copycat suicides with the least squares line in red (correlation: r = 0.74, p < 0.01).

As a subsequent *post hoc* analyses, we excluded the data of Celebrities 3, 8 and 12, for which exponential models rejected according to χ^2 tests. After exclusion of these three celebrities, the correlations with A or K improved, regardless of media types. All the p-values of the correlation values for the excluded data were equal to or less than 0.1 (see Table 4).

Discussion

Exponential modelling of copycat suicides

The present study implemented a quantitative approach utilising exponential modelling to investigate the actual amount and length of impact on actual suicides following a celebrity suicide. The strengths of our study include using a systematic method to select celebrity cases, compared with previous studies where single celebrity cases or self-selected cases were used. Additionally, we also utilised quantitative methods to explore an exponential model of copycat suicides. Our main findings of the study indicate that the majority of copycat suicides subsequent to celebrity deaths

followed an exponential model, which make it possible to quantify the pattern of the phenomenon of copycat suicides and predict the actual amount and length of impact on actual suicides after a celebrity suicide. There were three Celebrities (3, 8 and 12) for whom the exponential model was inadequate; in speculation of these three exclusions, the death of Celebrity 3 was involved with sharp controversy whether or not his death was a suicide or murder, whereas both Celebrities 8 and 12 suffered from depression, and their motivation for suicide was argued publicly and an autopsy for Celebrity 8 was conducted by request of his family. Thus, it is possible that public controversy surrounding the deaths of celebrities may have a substantial impact on copycat suicides and might delay the influence on copycat suicides and affect the model accuracies.

Media effects of copycat suicides

In our study, several individual significant associations between the number of media reports and copycat suicides were found, for both TV and newspaper reports. A majority of those significant associations was especially observed for those with higher number of media reports, indicating differential media effects based on the popularity of the celebrity. Additionally, when all 15 celebrities were pooled together, there were weak-to-moderate correlations between the amplitude and the rate of decline of the exponential models with the number of media coverage, showing more apparent associations for the data appropriate for exponential model fits.

The consistent pattern of a significant media association on the increase of copycat suicides following a celebrity suicide provides further evidence of the media effect, which has been reported in previous studies. The impact of media as a significant risk factor for copycat suicides following a celebrity suicide has been established through systematic reviews (Pirkis *et al.* 2001a, *b*; Stack, 2003, 2005). The recent study by Fu & Chan (2013) using South Korean data found only 3 out of 11 cases that were found to be followed by a

Table 4. Correlations of amplitude and rate of decline with media effect (p-value)

Cases		A	K
All celebrities considered	Number of newspaper reports	0.46 (0.08)	0.37 (0.18)
	Number of TV reports	0.43 (0.11)	0.39 (0.16)
	Total number of media	0.45 (0.09)	0.38 (0.16)
Celebrities other than Celebrities 3, 8 and 12	Number of newspaper reports	0.60 (0.07)	0.59 (0.07)
	Number of TV reports	0.54 (0.10)	0.59 (0.07)
	Total number of media	0.57 (0.08)	0.60 (0.07)

significant increase in copycat suicides, and the authors speculated that this may be due to relatively smaller coverage of the death of their selected celebrities. Of the 11 celebrities Fu and Chan selected, only seven overlapped with the celebrities selected for our study. Among the seven celebrities that overlapped with our study, our findings are consistent Fu and Chan's results for two celebrities (Celebrities 10 and 5) following a significant increase of copycat suicides following the celebrity death, and one celebrity (Celebrity 3) not following a significant increase of copycat suicides. The discrepancies for the remaining celebrities in our study compared with Fu and Chan's study may be associated with different methodological designs. Another study conducted in South Korea by Jeong et al. (2012) selected five celebrities to investigate the increase in suicide attempt visits to the emergency department following a celebrity death, and found an additional 0.4-0.6 increase in suicide attempt visits per week to an emergency department following a celebrity death. Among their five selected celebrities, four overlapped with our study, and their findings were largely consistent with our findings.

In order to prevent the increase of copycat suicides following a celebrity death, the World Health Organization (WHO) provides guidelines in which media reporting should be conducted to minimise the impact of celebrity suicides on people who are vulnerable to imitating a major suicide (World Health Organization, 2008). For example, WHO recommends that language which sensationalises or normalises suicide or presents it as a solution to problems should be avoided. Specifically, terms like 'unsuccessful suicide' imply that death is a desirable outcome and thus should be avoided, and replaced with alternative phrases such as 'non-fatal attempt', which are more accurate and less open to misinterpretation. Other additional guidelines include avoiding the following: language which sensationalises or normalises suicide or presents it as a solution to problems, prominent placement and undue repetition of stories about suicide, explicit description of the exact method used in a completed or attempted suicide, and provision of detailed information about the site of a completed or attempted suicide. While we did not investigate methods of suicide in our study, it is well-known that copycat suicides have a tendency to imitate the same method of suicide the celebrity used (Yip et al. 2006; Cheng et al. 2007; Fu & Yip, 2007, 2009).

Potential mechanisms and future directions

The copycat suicide phenomenon has been based on social cognitive theory, and thought to be caused

partially by being exposed to another person's suicide that subsequently leads to the imitation of suicidal behaviour (Mesoudi, 2009). Researchers have speculated that mass suicide increase following celebrity suicides result from prestige bias, where individuals prefer to copy the behaviour of individuals of high status or prestige (Henrich & Gil-White, 2001). From an evolutionary standpoint, this prestige can be seen as an adaptive mean of acquiring appropriate behaviour, as individuals of high status usually have reached their high status because of their adaptive behaviour in the first place. However, the prestige bias is also vulnerable to acquisition of maladaptive behaviour such as suicidal behaviour when such behaviour is displayed by prestigious individuals. Thus, copycat suicide may be a maladaptive by-product of what originally serves as an adaptive social learning rule (Mesoudi, 2009).

The results of this study are consistent with research from other countries that media reporting and celebrity suicide may have a contagious effect on copycat suicides. On a national level, improving media reporting and being careful about the portrayal of describing a celebrity suicide will be important. On a clinical level, identifying vulnerable populations in future studies will be important and providing preventative interventions should be established. A previous study suggested that prevention should start with suicide attempters who visit the emergency room, and a specific action plan should be set in place, as there was a high rate of discharge against advice (59.6%) and low follow-up compliance at the outpatient level (>50%) (Kim et al. 2013). Based on the results of our quantitative modelling of copycat suicides, future studies will be able to provide a quantitative framework to assess the effectiveness of future prevention strategies on copycat suicides.

Limitations

Despite the strengths of this study, such as the use of national database and investigating multiple celebrities, there are some limitations which must be noted. First, the present study only investigated celebrities in one nation, and thus generalisation to other countries may be limited. Second, our study did not examine vulnerability factors of copycat suicide that have been noted in previous studies (Cheng *et al.* 2007). Based on exponential modelling to quantify the exact impact of celebrity suicides used in this study, future studies should focus on vulnerable populations that are susceptible to the impact of celebrity suicides and media effects.

Conclusions

Our study found a consistent pattern of exponential models on the increase of copycat suicides following a celebrity suicide. The number of copycat suicides was highly associated with media coverage and duration, which was also moderately associated with the amplitude and rate of decline of copycat suicides. This study provides a quantitative framework of the actual amount and length of impact of a celebrity suicide, and can guide future prevention studies in assessing the effectiveness of intervention strategies.

Acknowledgement

We would like to thank Goeun Lee for helping us search for the media effects used in this study.

Financial Support

This research was supported by the Basic Science Research Programme through the National Research Foundation of Korea (NRF) funded by the Ministry of Education, Science and Technology (grant no. 2010-0023051).

Conflicts of Interest

None.

Ethical Standards

The authors assert that all procedures contributing to this work comply with the ethical standards of the relevant national and institutional committees on human experimentation and with the Helsinki Declaration of 1975, as revised in 2008.

References

- Cheng AT, Hawton K, Lee CT, Chen TH (2007). The influence of media reporting of the suicide of a celebrity on suicide rates: a population-based study. *International Journal of Epidemiology* **36**, 1229–1234.
- **Fu KW, Chan CH** (2013). A study of the impact of thirteen celebrity suicides on subsequent suicide rates in South Korea from 2005–2009. *PLOS One* **8**, 1–7.
- Fu KW, Yip PS (2007). Long-term impact of celebrity suicide on suicidal ideation: results from a population-based study. *Journal of Epidemiology and Community Health* 61, 540–546.

- **Fu KW, Yip PS** (2009). Estimating the risk for suicide following the suicide deaths of 3 Asian entertainment celebrities: a meta-analytic approach. *Journal Clinical Psychiatry* **70**, 869–878.
- **Henrich J, Gil-White FJ** (2001). The evolution of prestige: freely conferred deference as a mechanism for enhancing the benefits of cultural transmission. *Evolution and Human Behavior* **22**, 165–196.
- **Hvistendahl M** (2013). A new dawn for mental health. *Science* **339**, 506–507.
- Jeong J, Shin SD, Kim H, Hong YC, Hwang SS, Lee EJ (2012). The effects of celebrity suicide on copycat suicide attempt: a multi-center observational study. *Social Psychiatry and Psychiatry Epidemiology* **47**, 957–965.
- Kim WJ, Namkoong K, Kim JM, Yoon HJ, Lee E (2013). Does a copycat effect exist in the emergency department? International Journal of Psychiatry in Medicine 45, 59–72.
- **Mesoudi A** (2009). The cultural dynamics of copycat suicide. *PLoS One* **4**, e7252.
- Niederkrotenthaler T, Fu KW, Yip PS, Fong DYT, Stack S, Cheng Q, Pirkis J (2012). Changes in suicide rates following media reports on celebrity suicide: a meta-analysis. *Journal of Epidemiology and Community Health* **66**, 1037–1042.
- Phillips DP (1974). The influence of suggestion on suicide: substantive and theoretical implications of the Werther effect. American Sociological Review 39, 340–354.
- **Pirkis J, Blood RW** (2001*a*). Suicide and the media. Part I: Reportage in nonfictional media. *Crisis* **22**, 146–154.
- **Pirkis J, Blood RW** (2001*b*). Suicide and the media. Part II: Portrayal in fictional media. *Crisis* **22**, 155–162.
- Stack S (1987). Celebrities and suicide: a taxonomy and analysis, 1948–1983. American Sociological Review 52, 401–412.
- Stack S (2000). Media impacts on suicide: a quantitative review of 293 findings. Social Science Quarterly 81, 957–971.
- Stack S (2003). Media coverage as a risk factor in suicide. Journal of Epidemiology and Community Health 57, 238–240.
- **Stack S** (2005). Suicide in the media: a quantitative review of studies based on non-fictional stories. *Suicide and Life Threatening Behavior* **35**, 121–133.
- World Health Organization (2008). Preventing Suicide: a Resource for Media Professionals. World Health Organization: Geneva.
- Yang AC, Tsai SJ, Yang CH, Shia BC, Fuh JL, Wang SJ, Peng CK, Huang NE (2013). Suicide and media reporting: a longitudinal and spatial analysis. Social Psychiatry and Psychiatric Epidemiology 48, 427–435.
- Yip PS, Fu KW, Yang KC, Ip BY, Chan CL, Chen EY, Lee DT, Law FY, Hawton K (2006). The effects of a celebrity suicide on suicide rates in Hong Kong. *Journal of Affective Disorders* 93, 245–252.