

1 **Global warming causes an increase in sinkhole collapse –**  
2 **Case study in Florida, USA**

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9 **Abstract**

10 The occurrence frequency and intensity of many natural geohazards, such as  
11 landslides, debris flows and earthquakes, have increased in response to global  
12 warming. However, the effects of such on development and spread of sinkholes has  
13 been largely overlooked. Most research shows that water pumping and related  
14 drawdown is the most important factor in sinkhole development, but in this paper  
15 evidence is presented which highlights the role played by global warming in causing  
16 sinkholes. The state of Florida, USA is used as a case study in which the role of global  
17 warming is evident, based on correlation analysis between sinkhole collapse and peak  
18 drought periods. Three distinct drought and sinkhole collapse phases are evident  
19 between 1965 and 2006, along with eight peak periods of sinkhole collapse that lag  
20 slightly behind eight peak drought periods. A prediction equation is derived according  
21 to curve fitting and a correlation coefficient of 0.999 is determined. The results of this  
22 study confirm that global warming related to climate change has led to an increase in  
23 sinkhole collapse events in Florida over the past 50 years, which is of significance for  
24 studying the occurrence and prediction of other sinkhole collapse events and global  
25 warming on an international scale.

## 1 **Keywords**

2 Geohazard; Drought; Karst; Trend prediction; Curve fitting

## 3 **1. Introduction**

4 Global warming resulting from climate change has altered the occurrence  
5 frequency and intensity of many natural geohazards, including landslides, debris  
6 flows and earthquakes (Calbó et al., 2010; Coe and Godt, 2012; Seneviratne et al.,  
7 2012; Gariano and Guzzetti, 2016; Heuvel, et al., 2016; Turkington, et al., 2016;  
8 Yongming Lin, et al., 2017). As an example of the mechanism for this, research has  
9 shown that 5%–10% of global permafrost will melt if global temperatures rise by 2°C,  
10 causing a significant increase in landslides and mudslides (Dong and Jia, 2004).

11 Sinkholes are a widespread type of geohazard, mainly distributed in the United  
12 States, China, Italy, Spain and Russia (Gutiérrez, et al., 2014; Lei, et al., 2015). The  
13 impact of climate change on sinkhole occurrence is expected, because rising  
14 temperatures will change natural hydrological processes (Gabriella Szépszó, et al.,  
15 2014), enhance dissolution of limestone (Mulec and Prelovšek, 2014) and promote  
16 soil failure (Zhou, et al., 2014). Recent reviews in the literature have shown that  
17 sinkhole hazards will probably intensify in the future as a result of climate change  
18 (Thornbush MJ, 2017; Rogelio Linares, et al., 2017), but quantification of the impact  
19 on sinkholes has been limited. This is largely because of a lack of long-term  
20 hydrological and climate data, and a lack of representative sinkhole inventories,  
21 inclusive of chronological information.

22 In Florida, sinkhole collapse events are recorded in the Florida Subsidence Incident  
23 Report, authored by the Florida Geological Survey, which provides a primary publicly  
24 available sinkhole database. More than 2800 sinkholes have been reported in Florida  
25 since the 1950s, and 2786 of them were fully recorded between 1949 and 2006. The  
26 data recorded includes occurrence time, location, shape, dimensions, soil type, side  
27 slope, land use and land cover (Han, et al., 2016). The long-term and complete

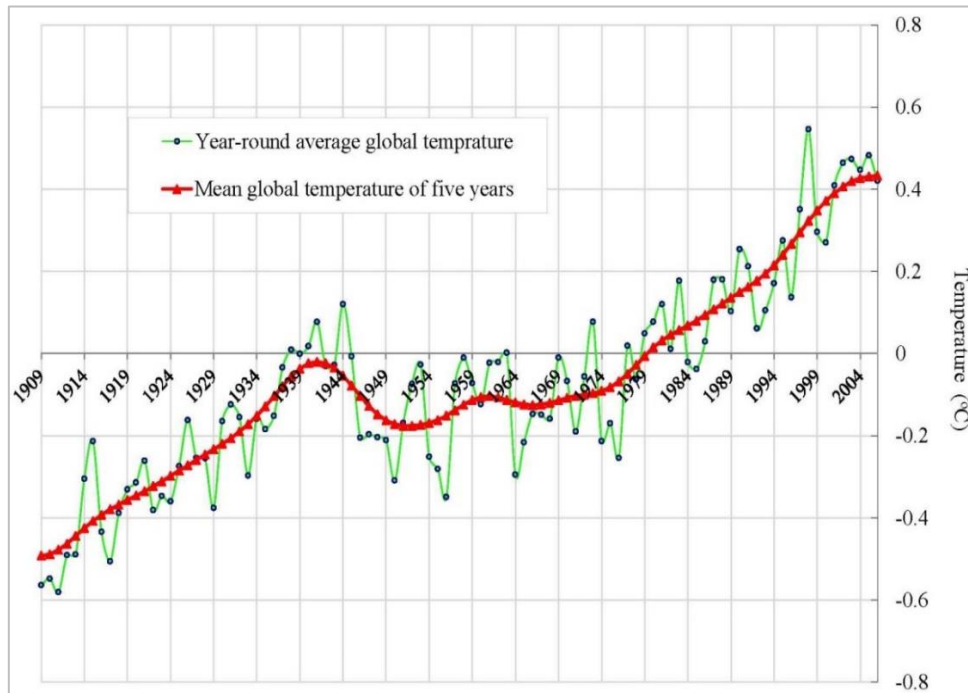
1 records of such sinkholes form the basis of the time peak relationship analysis  
2 between sinkhole collapse and global warming.

3 In this paper, the causal effects of global warming on sinkhole development and  
4 intensification are fully investigated using statistical analysis of sinkhole cases in the  
5 state of Florida, USA. In general, it can be shown that for every 0.1°C rise in global  
6 temperature, the number of sinkholes increases by 1%–3%.

## 7 2. Materials and methods

### 8 2.1. Global temperature

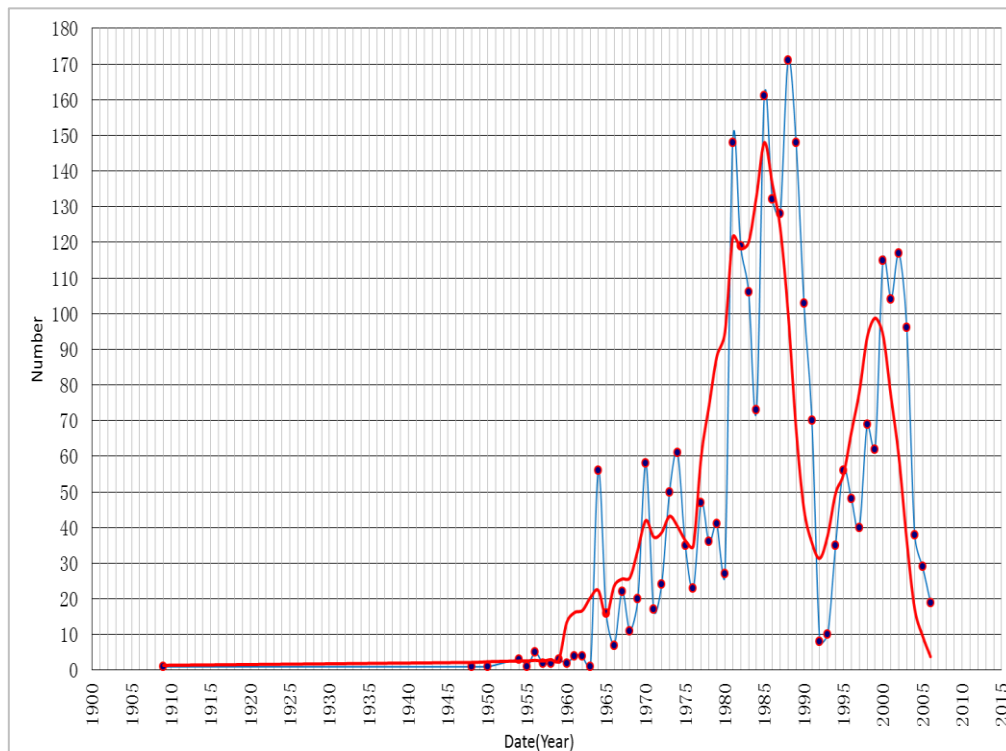
9 Global warming as a result of climate change is a quantifiable phenomenon (Shi et  
10 al., 2010; Gariano, et al., 2016; Turkington, et al., 2016), with a demonstrable increase  
11 in global temperatures by  $\sim 0.57^{\circ}\text{C}$  over the last century (Fig. 1). It has been reported  
12 that the global surface temperature is likely to rise a further 0.3 to 1.7°C in the lowest  
13 emissions scenario during the 21st century, or by 2.6 to 4.8°C in the highest emissions  
14 scenario (IPCC, 2013).



15  
16 **Fig. 1.** Global mean surface-temperature changes from 1909 to 2006. The green line  
17 is the global annual mean, and the red line is the five-year local regression line (based  
18 on [http://en.wikipedia.org/wiki/Global\\_warming](http://en.wikipedia.org/wiki/Global_warming)).

1 2.2. Sinkhole collapse events in Florida

2 The sinkhole collapses recorded in Florida have three distinct peaks (Fig. 2) and  
3 provide ideal research candidates, which is why this region was chosen for the study.  
4 The study is based on the 2786 sinkholes that have been well-documented.



5  
6 **Fig. 2.** Frequency of sinkhole formation between 1948 and 2006 in Florida, USA. The  
7 red line is the five-year local regression line (data obtained from the Florida Office of  
8 Insurance Regulation).

9 Most research has shown that pumping of water and associated drawdown is the  
10 leading cause of sinkhole formation and collapse (Anikeev and Leonenko, 2014;  
11 Youssef, et al., 2016; Rogelio Linares, et al., 2017). However, the impact of global  
12 warming should not be ignored. For example, altered global rainfall patterns and  
13 increasing evaporation because of higher temperatures leads to a decrease in  
14 groundwater flow, resulting in sinkhole formation, or such decreased flow may lead to  
15 intensification of water pumping and related drawdown in urban and industrial areas  
16 that in itself leads to groundwater level reduction and related sinkhole development.

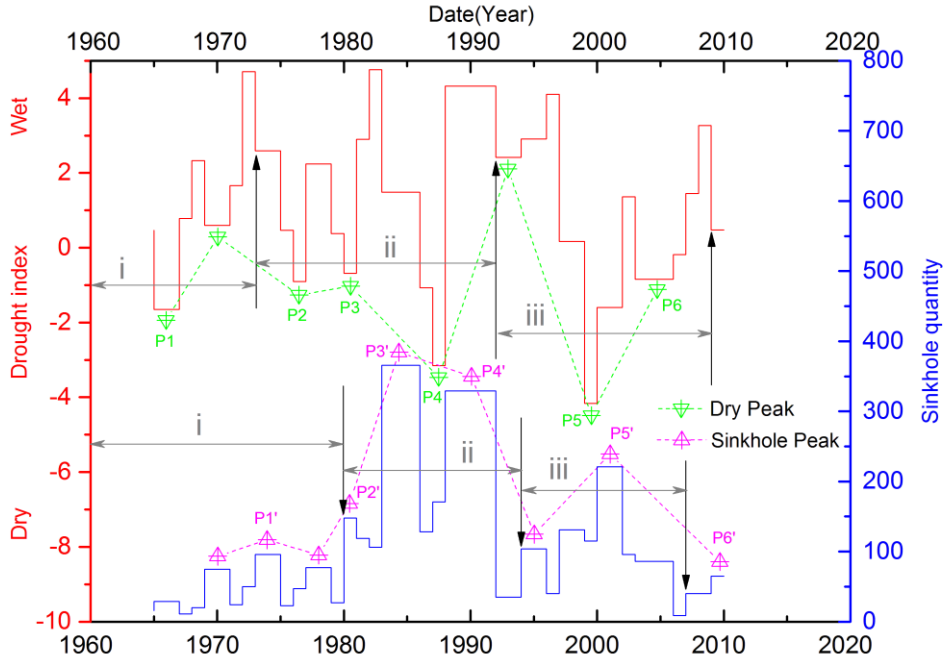
17 Also, the addition of greenhouse gases to the atmosphere and global warming

1 increase the dissolution of bedrock, thus increasing the intensity and frequency of  
2 sinkhole collapse (Yuan daoxian, 1997). This is especially true for areas underlain by  
3 limestone or dolomite, in which the basic carbonate dissolution formula  $\text{CaCO}_3 + 2\text{H}^+$   
4  $\rightarrow \text{Ca}^{2+} + \text{H}_2\text{O} + \text{CO}_2$  shows the breakdown of solid carbonates in acidic conditions.  
5 The carbonate dissolution formula is reversible, but will proceed in the positive  
6 direction as temperatures increase. In susceptible areas, some closed or previously  
7 blocked karst pipes or cracks will open up under conditions of dissolution, and form  
8 new soil erosion channels. Dehydration of the soil will occur as the temperature  
9 increases, and once runoff occurs or water levels rise, the dry soil will be removed,  
10 leading to erosion and disintegration as the sinkhole forms and collapses.

### 11 *2.3. Correlation analysis*

#### 12 *2.3.1 Sinkhole and drought peaks*

13 Droughts in the USA can be divided into three basic, consistent peak periods:  
14 Phase i between 1965 and 1973, Phase ii between 1973 and 1991 and Phase iii  
15 between 1991 and 2006. Sinkhole collapses in the USA can also be divided into three  
16 basic consistent peak periods: Phase i between 1968 and 1980, Phase ii between 1980  
17 and 1993 and Phase iii between 1993 and 2006. From Fig. 3 it is evident that the peak  
18 time and trend of sinkhole collapse events and drought periods are quite consistent. To  
19 further investigate the relationship, the association can be quantified using curve  
20 fitting analysis.



1

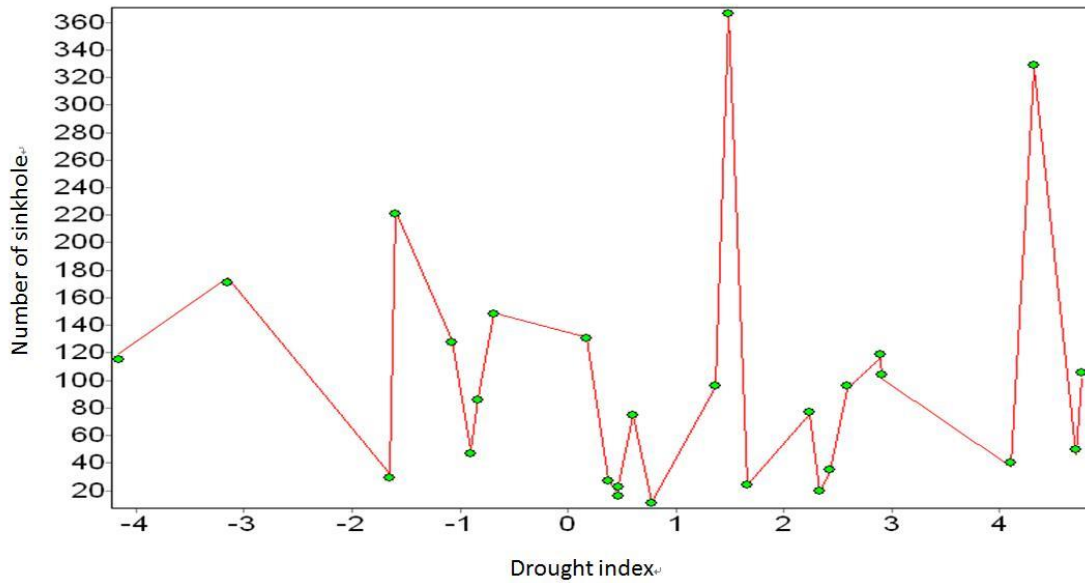
2 **Fig. 3.** Graphical illustration of the relationship between sinkhole quantity (blue) and  
 3 drought periods (red) in Florida, USA. Note the **six** peak “dry” and “sinkhole” periods  
 4 shown (P1–P6) and the three corresponding phases (i, ii, iii) of highly consistent  
 5 trends in sinkhole development and drought

6 *2.3.2. Curve fitting*

7 The curve of sinkhole collapse quantity and drought index (Alley, W.M., 1984)  
 8 can be fitted, as shown in Fig. 4, by Eq. (1).

9 
$$\sqrt{((X - B)^2 + (Y - A)^2)} - R = 0 \quad (1)$$

10 The algorithm is derived using the Quasi-Newton (Broyden Fletcher Goldfarb Shanno  
 11 (BFGS) and Universal Global(UG)) methods, where  $X$  is the drought index,  $Y$  is the  
 12 number of sinkhole collapses and  $A$ ,  $B$  and  $R$  are constant parameters. The correlation  
 13 coefficient is 0.999. The other parameters are shown in Table 1.



1

2 **Fig. 4.** Fitted curves of sinkhole collapse quantity and drought index.

3

4 **Table 1**

5 Algorithm and parameters of the drought time curve.

Equation	$\text{Sqrt}((X-B)^2 + (Y-A)^2) - R=0$	
	A 173.499	Optimization: Quasi-Newton Method(BFGS) + Universal Global
	B 8100.396	Calculation End: Meet convergence criteria
	R 8100.217	Mean square error(RMSE): 2.17562755356349
Algorithm and parameters		Residual sum of squares (SSE): 127.800591799266
		Correlation coefficient(R): 0.999689237322014
		The square of Correlation coefficient (R <sup>2</sup> ): 0.99937857121747
		Determine the coefficient(DC): 0.999378190981562
		Chi-Square coefficient: 0.958830651014433
	F-Statistic: 40204.8713912301	

6

7 **3. Conclusions**

8 There is a strong corresponding relationship between sinkhole quantity and  
 9 drought index shown in Fig. 3, which demonstrates the link between global warming  
 10 and increased development of sinkhole collapse events in Florida, USA. Eight peak  
 11 points (P1–P6) within three peak drought periods correspond to sinkhole peak periods

1 (P1'–P6'). The timing of sinkhole formation lags behind the drought by two to four  
2 years, which is geologically sensible, given that water pumping and drawdown, along  
3 with soil runoff caused by rain, will take some time after the onset of drought before  
4 the sinkhole opens.

5 This is significant for use by government disaster reduction departments, or  
6 insurers, who may require forward-modeling of likely future events, such as sinkhole  
7 collapse following periods of drought. This will allow for controls of sinkhole  
8 collapse to be established and to develop monitoring networks.

9 To clearly define the quantitative relationship between sinkhole collapse and  
10 drought, a curve fitting method was applied based on the optimization of Quasi-  
11 Newton (BFGS) and Universal Global methods. A prediction equation (Eq. 1) was  
12 also obtained according to the curve fitting.

13 It can be concluded that, if a drought period is forecast, the sinkhole quantity may  
14 also be forecast using the equation, and similarly, areas in which quantities of  
15 sinkholes are increasing may be considered clear subjects of the impacts of global  
16 warming.

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