

Article

Estimation of the Dependence of Ice Phenomena Trends on Air and Water Temperature in River

Renata Graf  

Department of Hydrology and Water Management, Institute of Physical Geography and Environmental Planning, Adam Mickiewicz University in Poznan, Bogumiła Krygowskiego 10 str., 61-680 Poznan, Poland; rengraf@amu.edu.pl

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Abstract: The identification of changes in the ice phenomena (IP) in rivers is a significant element of analyses of hydrological regime features, of the risk of occurrence of ice jam floods, and of the ecological effects of river icing (RI). The research here conducted aimed to estimate the temporal and spatial changes in the IP in a lowland river in the temperate climate (the Noteć River, Poland, Central Europe), depending on air temperature (TA) and water temperature (TW) during the multi-annual period of 1987–2013. Analyses were performed of IP change trends in three RI phases: freezing, when there appears stranded ice (SI), frazil ice (FI), or stranded ice with frazil ice (SI–FI); the phase of stable ice cover (IC) and floating ice (FoI); and the phase of stranded ice with floating ice (SI–FoI), frazil ice with floating ice (FI–FoI), and ice jams (IJs). Estimation of changes in IP in connection with TA and TW made use of the regression model for count data with a negative binomial distribution and of the zero-inflated negative binomial model. The analysis of the multi-annual change tendency of TA and TW utilized a non-parametric Mann–Kendall test for detecting monotonic trends with Yue–Pilon correction (MK–YP). Between two and seven types of IP were registered at individual water gauges, while differences were simultaneously demonstrated in their change trends over the researched period. The use of the Vuong test confirmed the greater effectiveness of estimates for the zero-inflated model than for the temporal trend model, thanks to which an increase in the probability of occurrence of the SI phenomenon in the immediate future was determined; this, together with FI, was found to be the most frequently occurring IP in rivers in the temperate climate. The models confirmed that TA is the best estimator for the evaluation of trends of the occurrence of IC. It was shown that the predictive strength of models increases when thermal conditions are taken into consideration, but it is not always statistically significant. In all probability, this points to the impact of local factors (changes in bed and valley morphology and anthropogenic pressure) that are active regardless of thermal conditions and modify the features of the thermal-ice regime of rivers at specific spatial locations. The results of research confirm the effectiveness of compiling a few models for the estimation of the dependence of IP trends on air and water temperature in a river.

Keywords: river icing; estimation; thermal conditions; regression models for count data; negative binomial distribution; zero-inflated model; Central Europe

1. Introduction

In a cool and temperate climate, ice phenomena (IP) in rivers are one of the elements of their winter hydrological and thermal regime. Information concerning river icing (RI) has a practical dimension, among others in regard to the identification of impediments to the operation of hydrotechnical equipment regulating water flows and levels, as well as the minimization of threats connected with ice jams and ice jam floods. As such, we are gathering data concerning the impact of these processes on the ecological state of waters, as well as the course of biochemical processes in the aquatic environment and

in flood-lands. RI may lead to changes in the conditions of the function of specific biotic communities that are susceptible to thermal stimuli [1,2].

It has also been indicated that the ice regimes of rivers are most susceptible to climate fluctuation [3,4]. However, research conducted on a global scale has disclosed different patterns of change in the occurrence of ice cover (IC) in RI conditions [5–7]. The spatial differentiation of the temporal trends of the duration of ice cover has been demonstrated for Arctic rivers [8,9]. A compilation of long-term data records (from the second half of the 20th century) has shown significant trends of in the shortening of the duration of RI for the Yukon, Ob, and Anabar rivers, as well as trends of the extension of this period (the MacKenzie, Pechenga, Pechora, Titovka, and Taz rivers). Numerous regional studies have confirmed the considerable spatial and interdecadal variability of RI conditions [10–12]. Tendencies of change in icing occurring in the past few decades are typical of the majority of rivers in the Northern Hemisphere [13–18]. Among others, a lower frequency of the occurrence of IP, as well as steadily later dates of the appearance of IC and its increasingly earlier disappearance are being documented; in some regions, no RI has been observed since the second half of the preceding century [19]. These tendencies have also been confirmed by the results of reports and research conducted during the past 40 years on European rivers [20], with it being demonstrated that the main reason for the disappearance of IP in rivers is the increasing frequency of warmer winters and an increase in river water temperature (by approximately 1–3 °C).

The mechanism governing the formation of IP in rivers is a complex process that is influenced by a great many variables: meteorological, hydrological, hydraulic, and hydromorphological. Long-term observations are most often used to analyze the relationship between the occurrence of IC with air temperature (TA), water temperature (TW), and geographical factors, which makes it possible to disclose the impact of zonal climatic effects. Numerical models describing the processes of river freezing and the development and disappearance of IC are used successfully, though they require reliable data concerning solar radiation, air temperature and humidity, wind speed and direction, etc., which, for many regions and river systems, are difficult to obtain due to the fact that no regular meteorological observations are conducted there [14]. Trend analyses have been mainly concerned with features such as autumnal dates of freezing, the spring dates of the disappearance of RI, and the duration of IC and ice thickness. It is rarely the case that analyses concern IP from the river freezing phase, e.g., stranded ice (SI) and frazil ice (FI) or the disappearance of IC or floating ice [4,5,21–25]. However, the question as to whether changes occurring on indicated dates can be explained by random factors or if they have a certain orientation in the form of statistically significant change trends remains of fundamental importance. While analyzing the IP in a river of the Votkinsk Reservoir catchment area, Kalinin and Chichagov [26] tested the hypothesis of randomness for both the entire observation series, and parts thereof, using among others the series autocorrelation and aggregate index diagnosis.

Among others, use has been of regression models with a relatively high level of precision that do not require a large number of input parameters in comparison to deterministic models [27]. Regression analyses make it possible to disclose significant predictors used in forecasting the occurrence and disappearance of RI, and one of these in the case of climatic factors is, without a doubt, TA [28]. Good indicators of the thermal conditions of the formation of ice cover are the cumulative freezing degree-days factor and the freezing index [29,30], which, among others, have been used in research into and the reconstruction of icing on rivers and lakes in Northern Europe [5] and on selected rivers in Poland, i.e., the Vistula [31] and the Noteć; in the case of the latter, consideration has been additionally given to circulatory determinants [23].

Of considerable importance for the persistence of IP on rivers is the transfer of thermal energy, which takes place on two levels: air–water and river bed–water [32,33]. Thermal instability in a river bed is a function of, among others, the transfer of heat originating from groundwater and its exchange occurring in the hyporheic zone; however, information about this is still insufficient. When assessing the role of the climate in controlling change trends in RI, research has been conducted on many scales and using various approaches, which has broadened the comprehensive analysis of

time series and spatial trends regarding IP phenology and their connections with climate pattern trends. In the case of large spatial patterns of atmospheric circulation, emphasis has been placed on determining and indicating those systems that control regional air temperature fluctuations [34–39], but the empirical dependencies between dates of occurrence of ice on rivers and TA indices may not be reliable under future climatic conditions. Certain RI effects are strongly controlled by processes occurring on the scale of the catchment area and the river bed (e.g., the dynamics and intensification of river ice breakage fronts), which must be taken into consideration in the analyses of local factors. In the future, the verification of the results of model studies and the validation of RI models will require obtaining information concerning the scope of change of hydroclimatic conditions and the impact of heat exchange on the atmosphere–bed or bed–subterranean water levels, which will enable the identification of step changes in the thermal and ice regime of rivers. According to the Arctic Monitoring and Assessment Programme (AMAP) [28], in order to obtain better results of ice regime forecasting, it is necessary to achieve progress in the integration of models that consider the compilation of future changes in landscape hydrology; the exchange of energy between water, ice, and air; flow hydraulics; and ice mechanics.

The objective of this research was to estimate temporal and spatial changes in RI in connection with thermal conditions. The research focused on IP change trends in the lowland Noteć River (Poland, Central Europe), these connected with three RI phases: freezing, the persistence of IC and floating ice (FoI) drift. The identification of time trends while taking TA and TW into consideration was intended to indicate significant estimators that correlate with both the number and the probability of occurrence of IP in a given year. Due to zero inflation in observation series, which means that IP may not appear during a year, it was assumed that the process governing the number of occurrences of IP is accompanied by a dichotomous process that determines whether a phenomenon has a chance of occurring in a specific year. Additionally, by taking monotonic TA and TW trends into consideration, it was planned to provide an answer to the question of whether changes in TA have contributed to an increase in TW in relation to reference periods, while at the same time leading to changes in river thermal and ice regimes. The identification of IP variability and trends in rivers is significant due to the economic utilization and ecological importance thereof.

2. Study Area

The analysis was conducted for the Noteć River (391.3 km long), a lowland European river (Central Europe) that is a tributary of the Warta River in the catchment area of the Oder River that flows into the Baltic Sea (Poland) (Figure 1). The Noteć River, which constitutes an important element of the shipping lane connecting the largest rivers in Poland (the Vistula and Oder Rivers), has considerable economic significance and significant natural value. The largest tributaries of the Noteć River are: The Gwda, Drawa, Noteć Mała, and Łobżonka rivers. The river catchment area is located in the following macroregions: The Toruń-Eberswald proglacial stream valley, through which the main bed of the river runs, and the South Pomeranian Lakelands, through which the right-bank tributaries of the Noteć River flow.

The landscape is dominated by a relatively continuous sandy-loamy cover of the Quaternary deposits, associated with the accumulation activity of the ice sheet and the fluvio-glacial and river waters. It is represented by frontal moraine hills, which are dissected by a network of glacial channels and river valleys. The substrate of the catchment consists of ablation sands and boulder loams. In the near-surface zone and on the surface, there are mainly sand and gravel formations of the Baltic Glaciation and the Holocene with a thickness of up to 40 m. These are river sediments of the middle and high terraces, dune sands, and peats. Peats build floodplain terraces, especially the valleys of the Noteć River and depressions with no outlets. The characteristic feature of the Upper Noteć is the presence of numerous lakes along its reach and near the tributaries, which occupy as much as 4% of the catchment area.

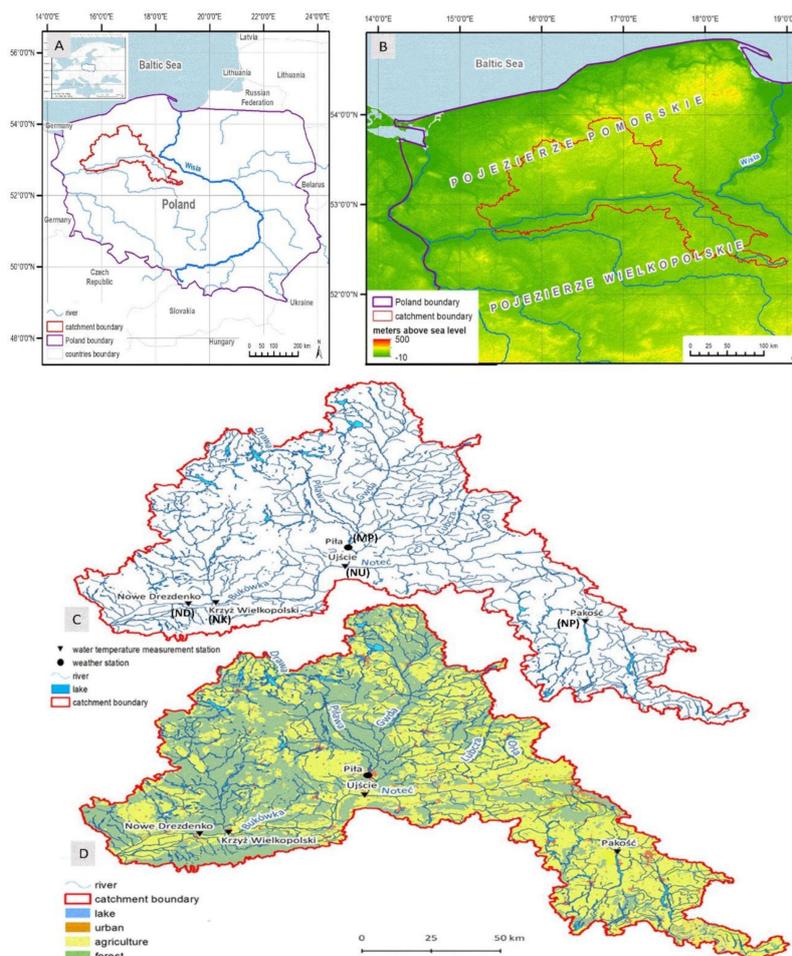


Figure 1. Location of the Noteć River catchment area: (A) in Poland (Central Europe), (B) digital terrain model, (C) river network with water gauges and weather station (Institute of Meteorology and Water Management-National Research Institute), and (D) land use (C,D according [23,40], partially modified).

The catchment area is predominantly agricultural and forest. The arable land and partly grassland are typically agricultural lands in the eastern part and forests in the western part (Figure 1). The study area is diverse in terms of natural conditions and is characterized by a mosaic of habitats with priority riparian forests and with a high diversity of hydrogenic habitats. The river valley, due to its significant natural values, is protected by its inclusion in the Natura 2000 areas, such as “Dolina Noteci” (the Noteć River Valley) and “Dolina Środkowej Noteci i Kanału Bydgoskiego” (the Middle Noteć River Valley and the Bydgoszcz Canal). In its middle reaches, the river is canalized and accessible by ships, while its water levels are regulated by a sluice system. A detailed physical and geographical description of the catchment area was presented in earlier studies authored by Graf [23,40].

The study area is the point of convergence of a number of climatic regions, i.e., the Western and Eastern Wielkopolska regions and the Western Pomeranian and Eastern Pomeranian regions, which is the result of the catchment area being located within reach of a number of physical and geographical regions. The average TA in the winter season ranges from -0.7 to -1.2 °C. On average, there are 40–72 days with a slight frost, starting, at the earliest, around 28–29 November and, at the latest towards, the end of February or in March. Days with very frosty weather sporadically occur and not on a yearly basis [23]. The studied catchment area is characterized by frequent low-intensity rains and unstable snow cover, as well as by the considerable infiltration capacity of soils and numerous depressions with no outlets [40].

The rivers in the region are characterized by a snow–rainfall recharge type. The Noteć River is classified among rivers with a medium developed nival regime, which is attributed to rivers with a

mean spring month flow (March–April) constituting 130–180% of the mean annual flow [41]. Its supply regime is characterized by a single fundamental maximum of levels and flows in spring and a minimum in the summer–autumn season. The maximum span of water level fluctuations in the lower reaches is about 3.5 m. The Noteć and the Drawa rivers are characterized by the longest duration of low water periods, which are 75 and 97 days, respectively. The average annual unit runoff from the catchment area for the period of 1971–2010 (according to the Institute of Meteorology and Water Management-National Research Institute (IMGW-PIB) data) in the Pakość section (the upper course of the river) is $3.5 \text{ dm}^3/\text{s}/\text{km}^2$ (the average flow rate $Q = 5.43 \text{ m}^3/\text{h}$ and the minimum flow $Q = 0.53 \text{ m}^3/\text{h}$), whereas it is $4.6 \text{ dm}^3/\text{s}/\text{km}^2$ (the average flow rate $Q = 74.8 \text{ m}^3/\text{h}$ and the minimum flow rate $Q = 23.2 \text{ m}^3/\text{h}$) in the Nowe Drezdenko section (the lower course of the river). The mean annual unit runoff from the catchment area is 90–100 mm. The Noteć River, as a tributary of the Warta River, has the lowest variability of daily flows and a very low variability of minimal flows, also in the winter season in which IP appear at the end of November/beginning of December and usually persist until the end of March [42]. In the winter season, the river supply and outflow conditions are modified by the occurrence of ice phenomena. The average duration of ice phenomena on the Noteć River is from 31 to 60 days. Permanent ice cover occurs at the end of December and lasts, on average, from 16 to 30 days.

The irregularity of extreme flows for the Noteć River results from the regulation of the river bed, by, among others, the erection of numerous fall stages that considerably modify the natural run-off regime. The mean daily water temperature in the lower reaches of the Noteć River changes seasonally from $3.6 \text{ }^\circ\text{C}$ (November–March) to $15.7 \text{ }^\circ\text{C}$ (April–October), reaching $18.8 \text{ }^\circ\text{C}$ in July. The temperature of flowing waters is sometimes increased by effluent discharges (thermal pollution and municipal and industrial sewage), particularly in the upper and middle reaches [40].

3. Materials and Methods

The analysis of IP change tendencies was conducted on the basis of daily data concerning the number and nature of phenomena occurring in the river, as well as daily TW and TA values for the period of 1987–2013. Use was made of data from four water gauge stations on the Noteć River (water gauge station symbols: Pakość—NP; Ujście—NU; Krzyż Wielkopolski—NK; and Nowe Drezdenko—ND) and the synoptic station in Piła (symbol: MP) (Figure 1) obtained from the IMGW-PIB (Warsaw, Poland).

Data are presented in relation to the hydrological year, which lasts from 1 November until 31 October in Poland. The complete RI cycle comprises 8 forms of ice occurrence: stranded ice (SI), frazil ice (FI), stranded ice and frazil ice (SI–FI), ice cover (IC), floating ice (FoI), stranded ice and floating ice (SI–FoI), frazil ice and floating ice (FI–FoI), and ice jam (IJ). TW measurements were performed daily at 7:00 a.m. (GMT + 1) using automatic station probes every 10 min with an accuracy of $0.1 \text{ }^\circ\text{C}$ (source IMGW-PIB); if these were unavailable, measurements were done by means of mercury thermometers (depth 40 cm) over a period of 5–10 min with an accuracy of $0.1 \text{ }^\circ\text{C}$. Measurements of air temperature (the ground surface) were taken at the meteorological stations of the IMGW-PIB by means of electrical sensors or mercury thermometers. The temperature measurement accuracy was $0.1 \text{ }^\circ\text{C}$. Mean daily air temperature resulted from eight measurements and was calculated according to the method: $(T00 + T03 + T06 + \dots + T21)/8$. The hours are given in Universal Time Coordinated (UTC) time (source IMGW-PIB) [38].

During the first stage of research, a determination was made of the IP subset observed at a given station that may be subjected to a reliable analysis of change tendencies over time. These phenomena were taken into consideration in the analysis if they occurred on at least 1% of cool days in hydrological half-year periods in the years 1987–2013 (Table 1).

Table 1. Forms of ice phenomena (IP) in the Noteć River with a frequency of occurrence of at least 1% of cool days in the hydrological half-year period in the years 1987–2013.

Water Gauge	The Form of the IP *
NP (Pakość)	SI * and IC
NU (Ujście)	SI, FI, SI-FI, IC, FoI, and SI-FoI
NK (Krzyż Wielkopolski)	SI, FI, SI-FI, and IC
ND (Nowe Drezdenko)	SI, FI, SI-FI, and IC

* IP symbols used in the study: SI—stranded ice; FI—frazil ice; SI-FI—stranded ice and frazil ice; IC—ice cover; FoI—floating ice; and SI-FoI—stranded ice and floating ice.

In order to determine the independence of observations, use was made of the Ljung–Box test [43], which makes it possible to indicate whether any group of time series autocorrelation is different than zero. The test statistic is:

$$Q = n(n + 2) \sum_{k=1}^h \frac{\hat{p}_k^2}{n - k} \tag{1}$$

where n is the sample size, \hat{p}_k is the sample autocorrelation at lag k , and h is the number of lags being tested. Under H_0 the statistic, Q asymptotically follows a $\chi^2_{(h)}$.

For significance level α , the critical region for rejection of the hypothesis of randomness is:

$$Q > \chi^2_{1-\alpha, h} \tag{2}$$

where $\chi^2_{1-\alpha, h}$ is the $1 - \alpha$ -quantile of the chi-squared distribution with h degrees of freedom.

Statistic $Q(m)$ of the Ljung–Box test, which is intended to ensure greater strength of the test for completed samples, has an asymptotic distribution of χ^2 for m degrees of freedom. In practice, the selection of maximum delay m has a considerable impact on the result of the test. It is usually conducted for a few different values of m .

During the initial data preparation stage, it was determined that both the time series of annual numbers of IP occurrences and the time series of mean annual TW and TA comprised independent observations (Table 2). For this reason, it was possible to analyze IP trends and their connections with temperature values by means of techniques that utilized the assumption of observation independence.

Table 2. Ljung–Box test results [43]. TW: water temperature; TA: air temperature; IJ: ice jam.

Water Gauge	NP		NU		NK		ND	
	X-squared	p-value	X-squared	p-value	X-squared	p-value	X-squared	p-value
SI	4.715	0.909	8.449	0.585	8.265	0.603	<1%	<1%
FI	<1%	<1%	8.628	0.568	13.83	0.181	9.047	0.528
SI-FI	<1%	<1%	13.79	0.183	<1%	<1%	<1%	<1%
IC	12.75	0.238	3.746	0.958	11.7	0.306	12.49	0.254
FoI	<1%	<1%	<1%	<1%	<1%	<1%	<1%	<1%
SI-FoI	<1%	<1%	1.932	0.997	<1%	<1%	<1%	<1%
IJ	<1%	<1%	<1%	<1%	<1%	<1%	<1%	<1%
TW (°C)	9.893	0.45	8.352	0.595	lack	lack	<1%	<1%
TA (°C)	X-squared = 6.286 p-value = 0.791							

Lag: df = 10 (delay).

The change tendencies of the appearance of IP on the Noteć River and their association with TA and TW were modelled in a set of non-negative integers using models from the general linear model

(GLM) group, which are based on sizes with excessive dispersion and zero inflation. Use was made of the logistic regression model for count data with a negative binomial distribution, because the data were characterized by considerable dispersion. The applied logistic regression model makes it possible to interpret results as odds, which are a function of probability. The general logistic model is described by the following formula:

$$y = b_0 / \{1 + b_1 \times \exp(b_2 \times x)\} \quad (3)$$

where y is expected value of the dependent variable, x is value of the independent variable, \exp is exponential function with a basis equal to e that is with a natural logarithm basis (exponent), and b is regression coefficient.

Regardless of the regression coefficients and the value of x , the model provides a result in the form of predicted y values in the range from 0 to 1. The models of regression thus defined required the analyzed observations to be independent of each other, which was confirmed—as stated above—through the Ljung–Box test [43].

At the same time, there was considerable zero inflation in the observation series, which would suggest that the process governing the number of occurrences of IP is accompanied by a dichotomous process that determines whether a phenomenon has a chance of occurring in a specific year. In this situation, use was made of the zero-inflated negative binomial model, which is usually applied if data have greater dispersion than indicated by the Poisson distribution, in which variance is equal to the mean, and if their distributions have an over-representation of zeroes. Zero-inflated models are a class of models that are able to cope with additional zeroes [44,45]. Probability distribution for the negative binomial distribution has the following form:

$$P(y_i = j) = \frac{\Gamma(y_i + \alpha^{-1})}{\Gamma(y_i + 1)\Gamma(\alpha^{-1})} \left(\frac{\alpha^{-1}}{\alpha^{-1} + \lambda_i}\right)^{\alpha^{-1}} \left(\frac{\lambda_i}{\alpha^{-1} + \lambda_i}\right)^{y_i} \quad (4)$$

where $\Gamma(\cdot)$ stands for the gamma function, $\alpha \geq 0$, $j = 0, 1, 2, \dots$.

The expected value of distribution is determined by the following formula:

$$E[y_i] = \lambda_i = \exp(X_i \beta) \quad (5)$$

where X_i is vector of explaining variables with sizes $(1 \times k)$ and β is vector of parameters with sizes $(k \times 1)$.

Whereas variance is equal to:

$$\text{Var}(y_i) = \lambda_i + \alpha \lambda_i \quad (6)$$

If $\alpha = 0$, we receive the Poisson regression model.

The statistical significance of the entire model, (the so-called global model significance test) was assessed using the likelihood ratio test (logLik). In the global maximum of the likelihood function, two explanatory variables were used: the variance of the slope χ^2 and the p -value.

The necessity of using the regression model for the zero-inflated negative binomial model was confirmed by the Vuong test [46,47], which demonstrated that this model was better suited to data than the negative binomial model alone (Table 3). The test statistic (Vuong z -statistic) is the relation of logarithmic probabilities of data between two competing models.

Table 3. Vuong test results.

Water Gauges	IP	Vuong z-Statistic	p-Value
NP	SI	1.09	0.137
	IC	1.90	0.028
NU	FI	−0.26	0.398
	SI	1.02	0.153
	IC	1.17	0.121
	SI–FI	−0.35	0.361
	SI–FoI	0.60	0.274
NK	FI	1.16	0.121
	SI	−0.78	0.215
	IC	3.48	0.0002
ND	FI	0.90	0.184
	IC	3.16	0.001

The analysis of the multi-annual tendency of TW and TA utilized a non-parametric test of the monotonic Mann–Kendall (MK) trend (MAKESSENS Excel template) with Yue–Pilon correction (MK–YP) [48]. The MK test is calculated as:

$$S = \sum_{i=1}^{n-1} \sum_{j=i+1}^n \text{sgn}(x_j - x_i) \quad (7)$$

where n is the number of data points; x_i and x_j are the data values in time series i and j ($j > i$), respectively; and $\text{sgn}(x_j - x_i)$ is the sign function as:

$$\text{sgn}(x_j - x_i) = \begin{cases} +1 & \text{if } x_j - x_i > 0 \\ 0 & \text{if } x_j - x_i = 0 \\ -1 & \text{if } x_j - x_i < 0 \end{cases} \quad (8)$$

The YP correction was used to decorrelate and detrend the data series in order for the MK test to provide reliable and unbiased results. The modified MK–YP test made it possible to effect an approximate determination of annual, semi-annual, and decadal temperature changes, as well as their changes throughout the entire period. Linear trend strength was estimated by means of the resistant Theil–Sen regression line slope estimator [49]. Analyses were conducted for decades only when data were available for at least 5 years. Years from two decades—the 1980s and the 2010s—were omitted from the research period (1987–2013) because it was not possible to estimate the trend of average annual temperatures using such a limited set of data. The calculations and the elaboration of the results of analyses were performed using the R calculational environment, version 3.3.2 (31 October 2016). The R suite (GNU R) is a software suite for analyzing data, as well as programming platform known as R [50]. The significance results of tests were assessed with reference to the adopted level of $\alpha = 0.05$. If a different significance level was adopted, relevant information is included next to the calculation results.

4. Results

4.1. Frequency and Thermic Conditions of Occurrence of IP

The analysis of the frequency of days with IP in the Noteć River disclosed the considerable differentiation of occurrences from 490 to 909 days (Table 4). On average, occurrences of the phenomena for between 21 and 40 days were recorded for individual years, with IP occurring more frequently in the middle and lower course of the river. The icing cycle, which encompasses the greatest number of forms of occurrence of ice in the river, was observed only in the middle course of the river (NU

water gauge), while at the remaining water gauges, this cycle was incomplete. The RI structure was dominated by phenomena from the first river freezing phase (SI and FI) and a constant IC, whereas phenomena from the final icing stage, i.e., the disintegration of the IC and the appearance of FoI, occurred least frequently. The greatest number of days with IC (251 and 385 days, respectively) was recorded in the upper and lower course of the Noteć River (NP and ND water gauges) (Table 4).

Table 4. Frequency of IP on the Noteć River in 1987–2013.

Water Gauges	SI	FI	SI-FI	IC	FoI	SI-FoI	FI-FoI	IJ	Sum of Days with IP	Average Number of Days with IP
NP—upper course	378	0	0	251	0	0	0	0	629	27
NU—middle course	534	90	11	69	31	63	111	0	909	40
NK—lower course	149	144	30	160	2	3	0	2	490	21
ND—lower course	53	240	54	385	0	0	0	0	732	32

A particular intensification of IP in the river occurred in the decades of 1990–2000 and 2001–2010, while the middle course (NU water gauge) had a period of IP intensification after 2010 (Table 5). The predominant phenomena were SI, FI, and IC.

Table 5. Icing structure of the Noteć River broken down into decades (1987–2013).

Water Gauge	Years (Decades)	SI	FI	SI-FI	IC	FoI	SI-FoI	FI-FoI	IJ
NP	80	10	0	0	13	0	0	0	0
	90	159	0	0	73	0	0	0	0
	0	151	0	0	105	0	0	0	0
	10	58	0	0	60	0	0	0	0
NU	80	16	12	0	32	2	22	5	0
	90	263	43	2	13	11	16	0	0
	0	156	25	15	45	18	15	1	0
	10	99	31	52	0	0	10	5	0
NK	80	13	15	6	43	2	0	0	2
	90	56	69	17	49	0	0	0	0
	0	69	33	7	28	0	0	0	0
	10	11	27	0	40	0	3	0	0
ND	80	14	107	2	173	0	0	0	0
	90	7	72	10	105	0	0	0	0
	0	3	29	23	28	0	0	0	0
	10	29	32	19	79	0	0	0	0

Explanations: red—greatest intensity of the phenomenon; green—no phenomenon.

An increase in the frequency of the occurrence of IP in the Noteć River was observed in the years 1996, 1997, and 2006, as well as in 1987 in certain instances (Figure 2). In 1996, their number exceeded 50 days in a year, while in the middle course of the river (NU water gauge), the number exceeded 100. In the winter season of the highlighted years there, an increase in the frequency of occurrence of days with a steadily lower TA (below $-10\text{ }^{\circ}\text{C}$) was observed, and this led to an increase in the number of days with IP (Figure 3). In the years 1987 and 1996, there was observed the lowest annual TA in the researched period at the station in Piła, which totaled 6.3 and $6.2\text{ }^{\circ}\text{C}$, respectively. During the period of 1987–2013, there were also years in which no IP occurred; these were primarily the years 1988–1990 and, at certain stations, 1995, 2001, and 2007–2008 (Figure 2). In the decade 2001–2010—when compared with the years 1991–2000—an increase in average annual TA in Piła of approximately $0.5\text{ }^{\circ}\text{C}$ was recorded. Regarding TW in the Noteć River, the difference between the indicated decades ranged from $0.3\text{ }^{\circ}\text{C}$ (lower course) to $0.4\text{ }^{\circ}\text{C}$ (middle course), whereas in the upper course (NP water gauge) during the period of 1990–2000, an increase in the average TW of $0.4\text{ }^{\circ}\text{C}$ was observed in relation to the average from the decade 2001–2010.

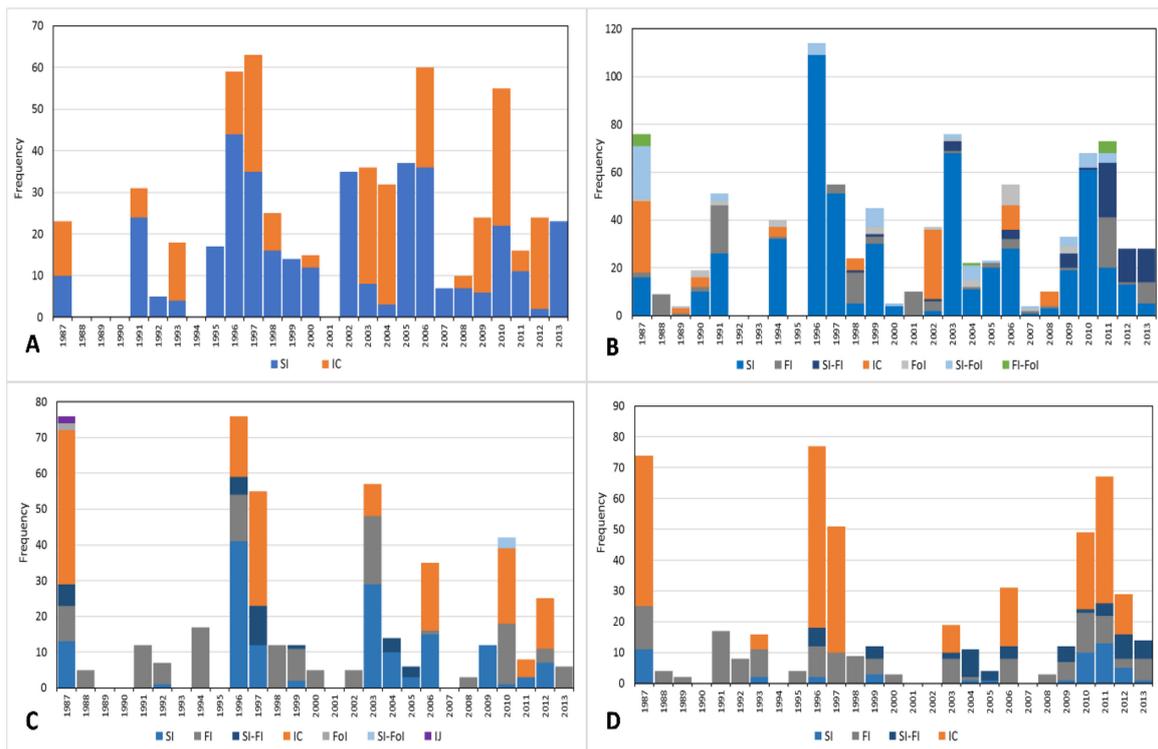


Figure 2. Annual freezing structure of the Noteć River (1987–2013): (A) NP; (B) NU; (C) NK; and (D) ND. Explanations of the IP symbols are in Section 2. Materials and Methods.

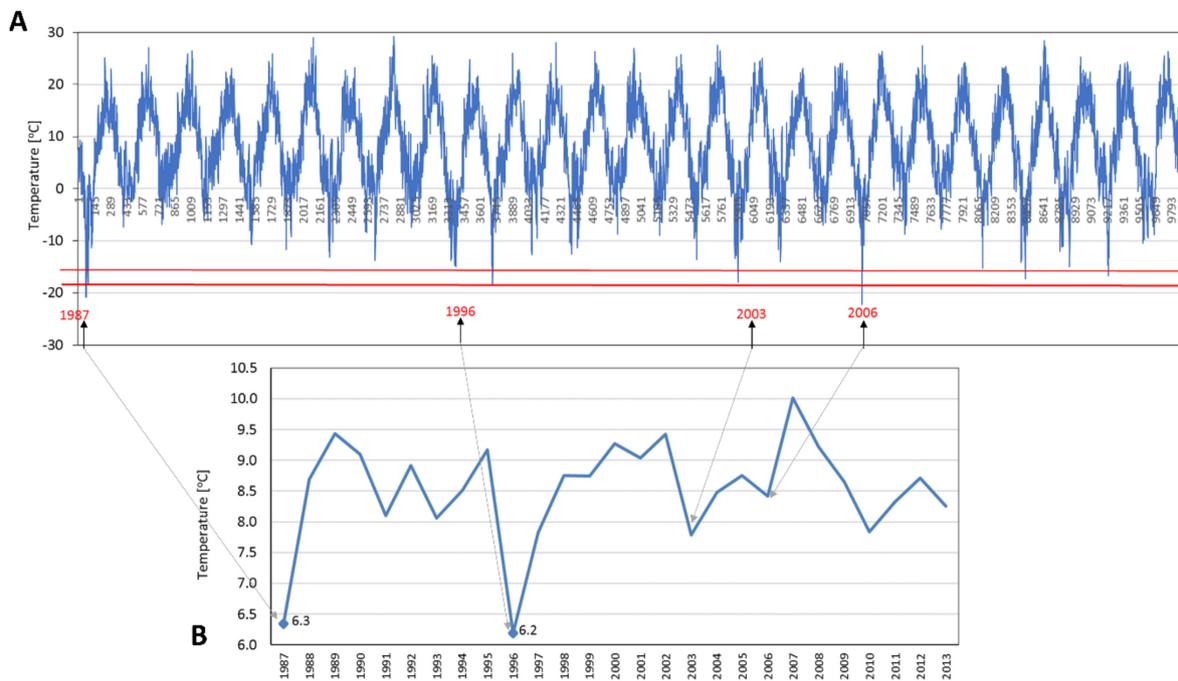


Figure 3. Distribution of daily (A) and average annual TA (B) in the synoptic station in Piła (MP) (1987–2013).

An analysis of average annual TA trends (station in Piła) and TW trends in the Noteć River (excluding the NK station, for which there were no data concerning TW) for the entire multi-annual period and individual decades disclosed no significant differences (Table 6). In the upper course of the river (NP water gauge) in the period of 1987–2013, a slight decreasing tendency of TW ($-0.19\text{ }^{\circ}\text{C}$)

when compared with the growth tendency of TW at the remaining stations (from 0.25 to 0.78 °C) was determined.

Table 6. Annual TW and TA trends from the multi-annual period and individual decades (1987–2013) with the exception of the 1980s and 2010s

Station	Period/Decade	dT	dTn	T0	tau	p-Value
NP	1987–2013	−0.007	−0.18	11.0	−0.13	0.332
	90	−0.081	−0.81	11.44	−0.38	0.175
	00	−0.0003	−0.002	11.04	0	1
NU	1987–2013	0.028	0.77	9.73	0.23	0.093
	90	0.004	0.04	9.95	−0.11	0.754
	00	0.041	0.41	10.21	0.27	0.348
ND	1987–2013	0.009	0.25	10.20	0.04	0.757
	90	−0.042	−0.42	10.51	−0.16	0.602
	00	0.0002	0.001	10.53	0.16	0.602
MP (meteorological station)	1987–2013	−0.001	−0.04	8.69	−0.12	0.377
	90	−0.027	−0.27	8.82	0.05	0.916
	00	−0.024	−0.24	8.98	0.05	0.916

Explanations: dT—annual trend effect (regression line slope coefficient); dTn—total trend effect for the entire period; T0—estimated average annual temperature at the beginning of the period (regression equation constant); tau—non-parametric Tau-b Kendall correlation coefficient between average annual temperature and the time step; and p—significance of non-parametric correlation (significance of the monotonic trend).

During the cool hydrological half-year period (from November to April) when IP were present in the Noteć River, the average TW in the upper and lower course of the river (at the NP and ND water gauges) was 4.4 °C and was only slightly higher than the TW measured along the middle section (NU profile), whereas the TA in the winter season remained, on average, at a level of 2.3 °C. In the cool half-year period (1987–2013), the TW change tendencies in comparison with the TA trend—which totaled −0.82 °C during the entire researched period—tended to vary (Table 7). Negative TW trends in the cool half-year period were demonstrated by measurement series in the upper course of the river (−0.84 °C at the NP profile) and in the lower course (−0.52 °C at the ND profile). In the middle course of the river (NU profile), the total effect of the trend for the entire period was slightly positive. In the cool half-year periods of the 1990s decade, the TA and TW trends were negative. The TW change tendencies along the Noteć River ranged from −1.37 °C in its lower course (ND water gauge) to −2.60 °C in its upper course (NP water gauge) (Table 7).

Table 7. TW and TA trends in the cool half-year period for the multi-annual period and decades, with the exception of the 1980s and 2010s.

Station	Period/Decade	dT	dTn	T0	tau	p-Value
NP	1987–2013	−0.031	−0.83	5.00	−0.206	0.145
	90	−0.260	−2.60	6.05	−0.611	0.028
	00	0.141	1.41	3.42	0.555	0.047
NU	1987–2013	0.001	0.04	3.65	−0.089	0.537
	90	−0.117	−1.17	4.17	−0.222	0.465
	00	−0.010	−0.10	3.77	0.111	0.754
ND	1987–2013	−0.019	−0.51	4.84	−0.236	0.093
	90	−0.137	−1.370	5.40	−0.333	0.251
	00	0.009	0.097	4.6	0.166	0.602
MP (meteorological station)	1987–2013	−0.030	−0.825	2.89	−0.150	0.290
	90	−0.165	−1.656	3.13	−0.166	0.602
	00	−0.030	−0.305	2.93	0.111	0.754

Explanations as for Table 6.

TW change tendencies in the Noteć River and TA change tendencies at the MP in the cool half-year periods of the analyzed term are presented in Figure 4.

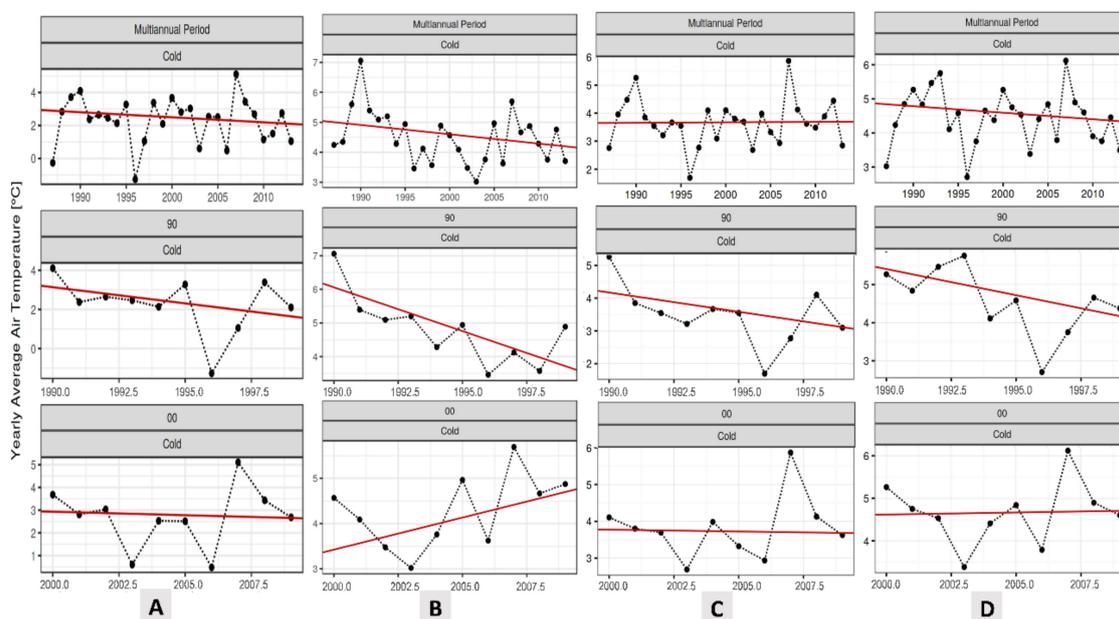


Figure 4. Yearly average TA (A) and TW: (B) NP, (C) NU and (D) ND change tendencies in the Noteć River during the period 1987–2013.

In the following decade (2000–2010), in the winter half-year period, the change tendencies of TW in the upper course of the river (NP water gauge) definitely changed in comparison with the preceding decade, when the trend changed from negative to positive (1.42 °C) (Table 7 and Figure 4). Similar changes, albeit of lesser intensity, were recorded in the lower course of the Noteć River (ND water gauge). Meanwhile, the negative TW trend in the winter half-year period persisted throughout all the decades in the middle course of the river (NU profile), with the negative TA trend being maintained throughout the entire researched period and in individual decades.

4.2. Linkage of Ice Phenomena Trends With Air and Water Temperature

The analysis of IP tendencies in the Noteć River covered four measurement stations at which different RI cycles were identified. The phenomena occurred irregularly, while in certain instances, they were relatively rare. For this reason, the analysis was conducted only for those IP that, in any given instance, occurred on at least 1% of days of the cool half-year hydrological periods of the researched period.

The assessment of trends of the occurrence of phenomena from first RI phase concerned the following: SI, FI, and SI–FI. The model estimating the number of occurrences of SI in the Noteć River, taking connections with TW and TA into consideration, concerned three water gauges with the exception of ND (lower course) and was, in each instance, globally statistically significant at levels of $\chi^2(6) = 13.74$ and $p < 0.01$ (NP water gauge), $\chi^2(6) = 27.35$ and $p < 0.001$ (NU water gauge), and $\chi^2(4) = 20.62$ and $p < 0.001$ (NK water gauge). This means that the number and annual probability of occurrence were governed by systematic trends. Even though the model was globally significant, in the upper course of the river (NP), none of the individual estimators attained a level of statistical significance. The temporal trend for the zero-inflated model was very close to significance ($p = 0.055$) and negative (Table 8), which would suggest that in successive years, the probability of occurrence of stranded ice may be steadily greater, though this effect was relatively weak. In the middle course of the river (NU water gauge), the occurrence of SI was connected with the average annual TA, and the connection was negative and statistically significant at the level of $\alpha = 0.001$ (Table 8). At the same time,

the occurrence of a negative temporal trend in the zero-inflated model was determined, which means that the probability of occurrence of SI in successive years may be steadily greater, similarly to in the upper course. In the lower course of the Noteć River (NK profile), due to the lack of data concerning TW, consideration was only given to average annual TA, which was a significant individual change estimator in the model for the number of days with SI (Table 8).

Table 8. Temporal trend model for SI on the Noteć River (1987–2013), taking the relationship with average annual TW and TA into account.

Model	Count Model Coefficients (Negbin with Log Link)				Zero-Inflation Model Coefficients (Binomial with Logit Link)			
	Frequency—Number of Days				Zero			
Statistics	Estimate	Std. Error	z Value	Pr(> z)	Estimate	Std. Error	z Value	Pr(> z)
NP (water gauge)								
(Intercept)	0.85	3.94	0.21	0.828	−17.11	19.04	−0.88	0.368
TimeTrend	0.004	0.02	0.18	0.853	−0.32	0.16	−1.92	0.054
TA	−0.39	0.24	−1.61	0.105	1.95	1.68	1.15	0.246
TW	0.48	0.46	1.04	0.296	0.13	2.14	0.06	0.948
NU								
(Intercept)	10.83	4.66	2.32	0.020 *	−19.11	15.36	−1.24	0.213
TimeTrend	0.001	0.03	0.04	0.962	−0.32	0.15	−2.05	0.039 *
TA	−1.06	0.29	−3.57	0.0003 ***	1.19	1.25	0.94	0.342
TW	0.10	0.57	0.18	0.856	1.04	1.87	0.55	0.577
NK								
(Intercept)	10.08	3.22	3.12	0.001 **	−18.37	11.06	−1.66	0.096
TimeTrend	0.07	0.06	1.04	0.295	−0.14	0.13	−1.07	0.282
TA	−1.12	0.49	−2.26	0.023 *	2.33	1.35	1.72	0.084

Explanations: Estimate—regression coefficient in the model for counts (negative binomial distribution); Std. Error—standard error of the regression coefficient in the model for counts; “z value”—z test statistic for the regression coefficient in the model for counts; Pr (> | z |)—significance level of the regression coefficient in the model; (Intercept)—constant of the regression equation; TimeTrend—annual time trend; TW—average annual water temperature; and TA—average annual air temperature. Significance levels: 0.0001 ***, 0.001 **, and 0.05 *.

In all instances, the change in trends over time displayed a similar dynamic, i.e., a growth trend in the initial period of observations, that thereafter steadily disappeared (Figure 5). This was the effect of opposing temporal trends cancelling each other out, i.e., the trend of the number of occurrences and that of the zero-inflated process (NP and NU water gauges). In the case of integrated models, no clear evidence was obtained for the occurrence of any systematic trend, decreasing or increasing.

The model estimating the number of occurrences of FI in the Noteć River, when taking connections with TW and TA into consideration, concerned three water gauges, with the exception of NP, where no such phenomena were recorded (Table 9). For the lower course of the river (ND profile), the model was globally statistically significant at a level of $\chi^2(6) = 20.65$ and $p < 0.001$, whereas for the following water gauges—NU ($\chi^2(6) = 7.02$ and $p = 0.135$) and NK ($\chi^2(4) = 6.43$ and $p = 0.169$)—the model turned out to be statistically insignificant, which means that neither the number nor the annual probability of occurrence of FI were dependent on average annual temperatures and were not governed by systematic trends.

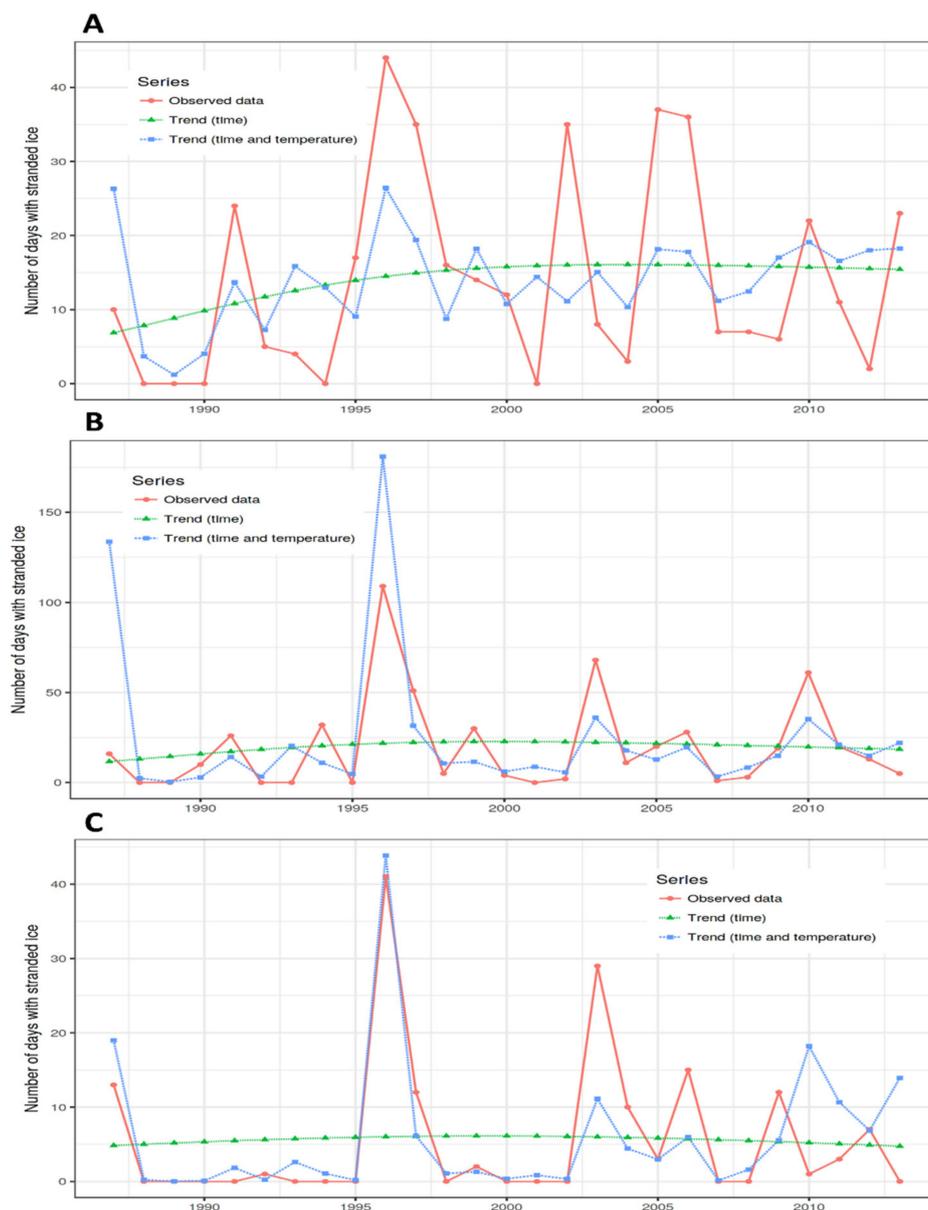


Figure 5. Trends of occurrence of SI in the Noteć River in the years 1987–2013: (A) NP (upper course), (B) NU (middle course), and (C) NK (lower course).

Table 9. Temporal trend model for FI on the Noteć River (1987–2013), taking the relationship with average annual TW and TA into account.

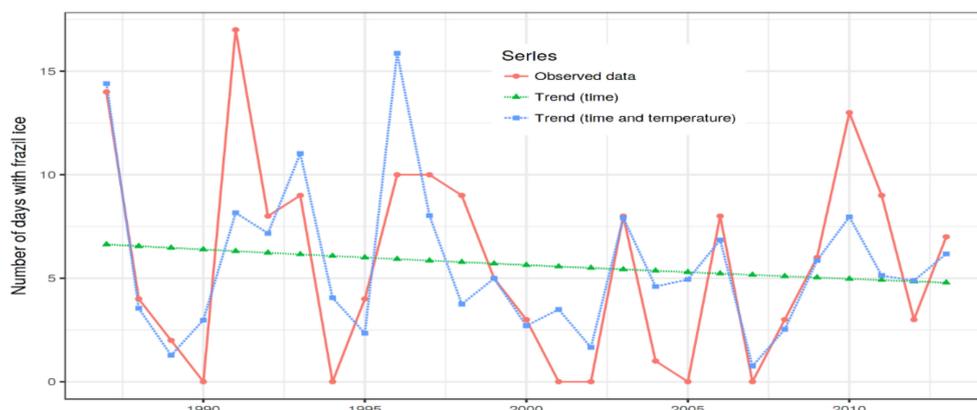
Model	Count Model Coefficients (Negbin with Log Link)				Zero-Inflation Model Coefficients (Binomial with Logit Link)			
	Frequency—Number of Days				Zero			
Statistics	Estimate	Std. Error	z Value	Pr(> z)	Estimate	Std. Error	z Value	Pr(> z)
NU (water gauge)								
(Intercept)	6.53	7.30	0.89	0.371	6.83	829.34	0.008	0.993
TimeTrend	0.01	0.03	0.42	0.670	2.231	22.81	0.097	0.922
TA	−0.57	0.57	−1.01	0.311	−35.82	131.08	−0.273	0.784
TW	−0.02	0.85	−0.03	0.975	22.41	155.00	0.144	0.884

Table 9. Cont.

Model	Count Model Coefficients (Negbin with Log Link)				Zero-Inflation Model Coefficients (Binomial with Logit Link)			
	Frequency—Number of Days				Zero			
Statistics	Estimate	Std. Error	z Value	Pr(> z)	Estimate	Std. Error	z Value	Pr(> z)
NK								
(Intercept)	4.89	1.38	3.52	0.0004 ***	-7.75	5.51	-1.406	0.159
TimeTrend	-0.007	0.01	-0.41	0.680	-0.007	0.05	-0.143	0.886
TA	-0.31	0.17	-1.86	0.062	0.86	0.632	1.37	0.169
ND								
(Intercept)	1.11	2.22	0.50	0.616	-17.77	18.03	-0.98	0.324
TimeTrend	-0.003	0.01	-0.33	0.740	0.002	0.07	0.03	0.973
TA	-0.865	0.27	-3.17	0.001 **	2.77	1.83	1.50	0.131
TW	0.795	0.40	1.97	0.048 *	-0.77	2.55	-0.301	0.762

Explanations as in Table 8, significance levels: 0.0001 ***, 0.001 **, and 0.05 *.

In the model for FI at the ND water gauge, important individual estimator included average annual temperature: TA was negatively connected with the occurrence of FI, while TW was connected positively (Table 9). However, no clear systematic trend was noticeable in the observed data and trend graphs (Figure 6).



Explanations: The model for the NU and NK water gauges turned out to be statistically insignificant, and, thus, the distribution of change tendencies has not been presented graphically, with only an interpretation being provided of the number of occurrences of FI in individual years.

Figure 6. Trends of occurrence of FI on the Noteć River at the ND water gauge (1987–2013).

The model forecasting the number of occurrences of SI–FI, which takes connections with temperature into consideration, was determined solely for the middle course of the river (NU water gauge). Globally, the model was statistically significant for $\chi^2(6) = 30.12$ and $p < 0.001$, while its analysis demonstrated a significant and rather clear growth trend of the number of occurrences of the phenomenon over time (Table 10 and Figure 7). However, none of the estimators were statistically significant in the case of the zero-inflated model.

Table 10. Temporal trend model for SI–FI on the Noteć River (NU water gauge), taking the relationship with average annual TW and TA (1987–2013) into account.

Model	Count Model Coefficients (Negbin with Log Link)				Zero-Inflation Model Coefficients (Binomial with Logit Link)			
	Frequency—Number of Days				Zero			
	Estimate	Std. Error	z Value	Pr(> z)	Estimate	Std. Error	z Value	Pr(> z)
(Intercept)	−7.68	8.22	−0.93	0.350	−301.4	273.4	−1.10	0.270
TimeTrend	0.26	0.05	5.17	2.33×10^{-7} ***	−0.60	1.151	−0.52	0.601
TA	−0.24	0.63	−0.38	0.698	11.3	13.3	0.84	0.397
TW	0.55	0.88	0.63	0.526	19.7	20.4	0.96	0.334

Explanations as in Table 8, significance levels: 0.0001***, 0.001 **, and 0.05 *.

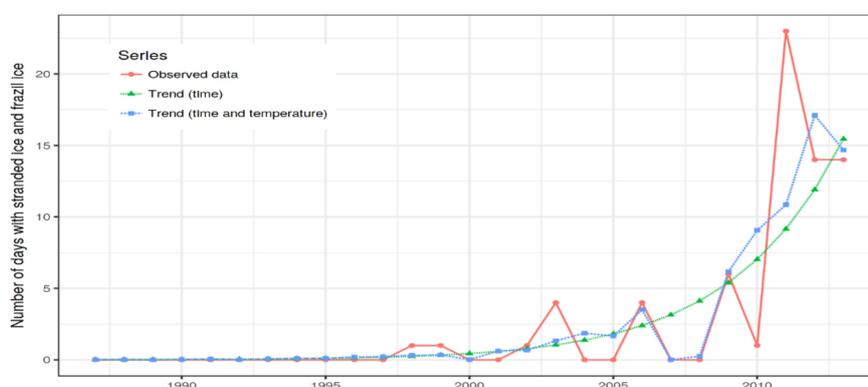


Figure 7. Trends of the occurrence of SI–FI on the Noteć River at the NU water gauge (1987–2013).

The model for the occurrence of IC in the Noteć River, connected with average TW and TA, concerned all four water gauges. Globally, it was statistically significant at a level of $\chi^2(6) = 24.70$ and $p < 0.001$ (NP water gauge), $\chi^2(6) = 12.54$ and $p = 0.051$ (NU profile, on the threshold of significance), $\chi^2(4) = 27.06$ and $p < 0.001$ (NK profile), and $\chi^2(4) = 27.06$ and $p < 0.001$ (ND water gauge). In the upper course of the Noteć River (NP profile), the number of occurrences of IC was associated with average annual TA, which correlated with both the number of occurrences and the probability of occurrence of IC in a given year (zero-inflated process) (Table 11). The strongest estimator (on the threshold of significance) turned out to be the effect of the growth trend of the number of occurrences of IC, whereas the trend for the zero-inflated process was insignificant but concordant regarding direction with the trend of the number of occurrences. Regarding the IC model, in the middle course (NU water gauge), the low predictive strength was connected with the very low significance of a part of the model for the zero-inflated process. In this instance, occurrences of IC were connected with average annual TW (negative correlation) and time—a significant, albeit slight, growth trend was determined (Table 11).

Concerning the number of occurrences of days with IC in the lower course of the river (NK water gauge), the time trend (negative) turned out to be a significant estimator, while in the case of the zero-inflated process, there was an average annual TA (Table 11). In the lower course of the Noteć River (ND profile), occurrences of IC were associated with the average annual TA, which correlated with both the number of occurrences and the probability of occurrence of IC in a given year (zero-inflated process). The sole estimator that attained statistical significance was the effect of the average annual TW, which turned out to be negatively correlated with the number of occurrences of IC (Table 11).

Table 11. Temporal trend model for IC in the Noteć River, taking the relationship with average annual TW and TA (1987–2013) into account.

Model	Count Model Coefficients (Negbin with Log Link)				Zero-Inflation Model Coefficients (Binomial with Logit Link)			
	Frequency—Number of Days				Zero			
Statistics	Estimate	Std. Error	z Value	Pr(> z)	Estimate	Std. Error	z Value	Pr(> z)
NP (water gauge)								
(Intercept)	8.01	3.91	2.04	0.040 *	−83.2	42.9	−1.93	0.052
TimeTrend	0.04	0.02	1.95	0.050	−0.09	0.08	−1.14	0.250
TA	−0.44	0.261	−1.64	0.101	0.73	1.53	0.48	0.630
TW	−0.22	0.38	−0.58	0.557	7.06	4.39	1.60	0.107
NU								
(Intercept)	22.4	6.64	3.38	0.0007 ***	3.44	10.8	0.31	0.750
TimeTrend	0.16	0.06	2.53	0.011 *	0.10	0.08	1.27	0.203
TA	−0.03	0.24	−0.16	0.870	−0.57	0.82	−0.69	0.487
TW	−2.15	0.79	−2.70	0.006 **	0.08	1.50	0.05	0.953
NK								
(Intercept)	2.13	1.77	1.19	0.230	−40.3	20.8	−1.93	0.052
TimeTrend	−0.06	0.02	−2.40	0.016 *	−0.23	0.12	−1.80	0.071
TA	0.24	0.27	0.86	0.384	5.35	2.63	2.03	0.041
ND								
(Intercept)	20.0	4.56	4.39	1.13×10^{-5} ***	−22.9	27.7	−0.82	0.407
TimeTrend	0.003	0.02	0.14	0.883	−0.19	0.13	−1.49	0.135
TA	1.22	0.74	1.63	0.102	8.99	4.69	1.91	0.055
TW	−2.68	0.98	−2.72	0.006 **	−4.77	4.55	−1.04	0.294

Explanations as in Table 8, significance levels: 0.0001 ***, 0.001 **, and 0.05 *.

Over time, in the model for the upper course of the Noteć River (NP profile), a slight growth trend of IC became apparent (Figure 8), whereas in the middle course (NU water gauge), the temporal trend started to grow only after temperature fluctuations were taken into consideration. This would suggest that in this instance, the issue of occurrence of the trend was, on the whole, ambiguous and unclear, i.e., the observed slight decreasing trend could have been exclusively caused by temperature fluctuations, while if these fluctuations had not occurred, the number of occurrences of IC in the river could have even increased slightly. In the lower course of the river (NK profile), the disclosed negative trend was practically unnoticeable due to the fact that there was present an opposing trend that bordered on significance in the zero-inflated model. This means that the later the year, the more chance there was of the occurrence of IC, and thus, finally, the two tendencies cancelled each other out. Meanwhile, in the final profile of the lower course of the Noteć River (ND profile), the estimated trend for time alone was, practically, ideally flat, which would point to the lack of systematic changes in the occurrence of IC (Figure 8).

The assessment of trends connected with the disappearance of IP in the Noteć River only concerned occurrences of SI–FoI at the NU water gauge (middle course). At the remaining stations, no phenomena from the third and final phase (disappearance of RI) were recorded for at least 1% of days of the cool hydrological half-year periods in the researched period. The model for SI–FoI in the river was globally statistically significant for $\chi^2(6) = 18.72$ and $p = 0.005$. At the same time, none of the individual estimators were significant for either the number of occurrences or the annual probability of occurrence (Table 12). Thus, it is difficult to determine which of the variables were most important in this instance.

The dynamic of changes in the occurrence of SI–FoI displayed a lack of any systematic temporal trend (Figure 9); however, taking temperature—in this case TW—into account allowed for a better estimation of the fluctuation of the number of occurrences of IP in the Noteć River.

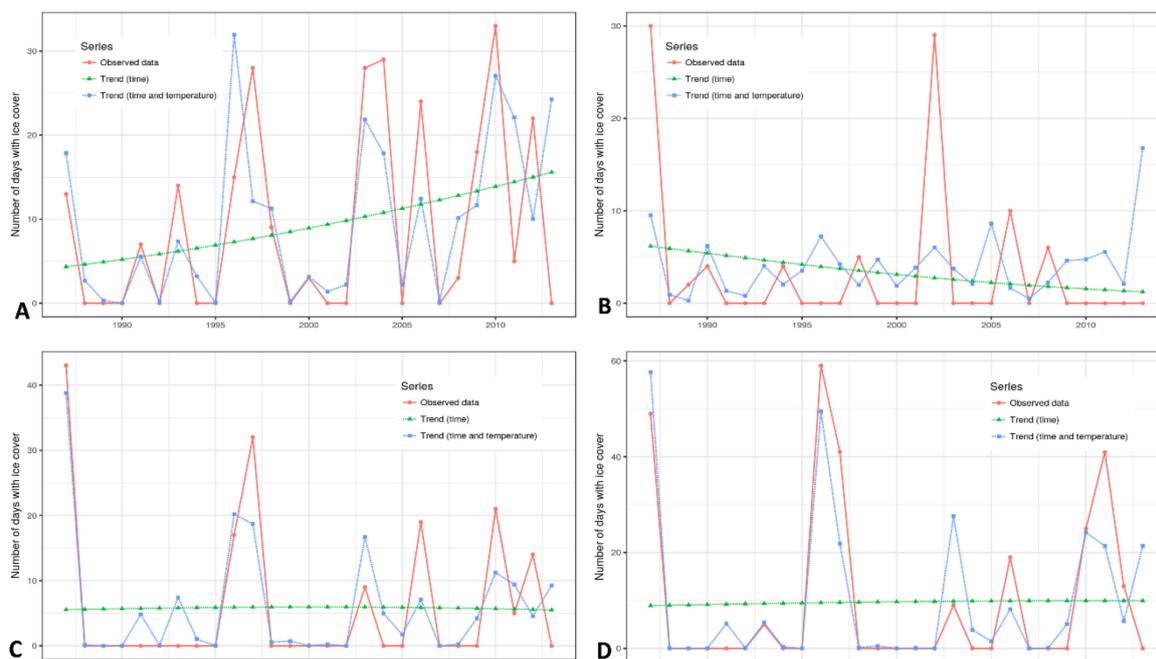


Figure 8. Trends of the occurrence of IC in the Noteć River (1987–2013): (A), NP (upper course), (B) NU (middle course), (C) NK, and (D) ND (lower course).

Table 12. Temporal trend model for SI-FoI in the Noteć River at the NU water gauge, taking the relationship with average annual TW and TA (1987–2013) into account.

Model	Count Model Coefficients (Negbin with Log Link)				Zero-Inflation Model Coefficients (Binomial with Logit Link)			
	Frequency—Number of Days				Zero			
Statistics	Estimate	Std. Error	z Value	Pr(> z)	Estimate	Std. Error	z Value	Pr(> z)
(Intercept)	9.90	7.66	1.29	0.196	39.0	623.1	0.06	0.950
TimeTrend	−0.01	0.05	−0.23	0.811	−10.0	32.5	−0.30	0.758
TA	−0.41	0.65	−0.63	0.5278	107.1	337.4	0.31	0.750
TW	−0.52	1.19	−0.43	0.660	−86.3	213.9	−0.40	0.686

Explanations as in Table 8, significance levels: 0.0001 ***, 0.001 **, and 0.05 *.

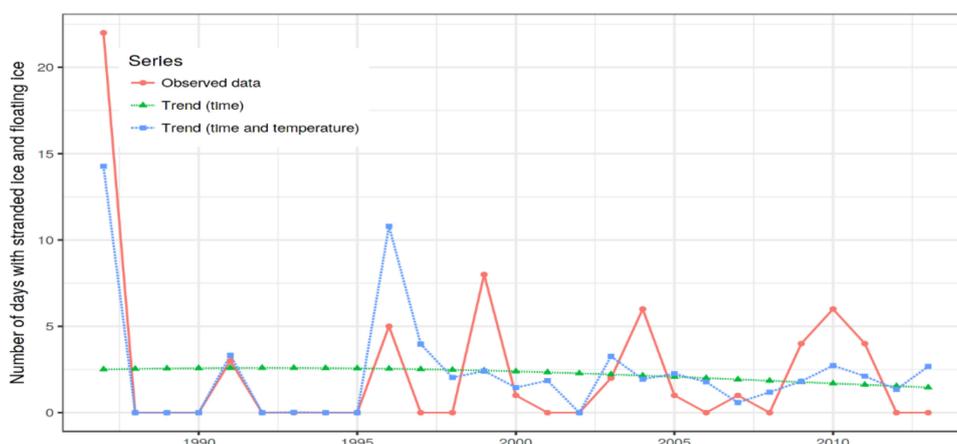


Figure 9. Trends of the occurrence of SI-FoI in the Noteć River at the NU water gauge (1987–2013).

5. Discussion

Under conditions of the temperate climate, the RI process progresses with varying intensity, more or less regularly in various phases [14,16,32], and this was confirmed by the results obtained for the Noteć River. In Poland, the average dates of appearance of ice phenomena on rivers, as well as the dates of their disappearance, vary considerably [22,24,25,31,42,51–53].

In the present case, a small number of situations (middle course) occurred where RI appeared in three successive phases: the formation of IP, the presence of stable IC, and the disappearance of icing (Tables 4 and 5), which is a rather rare phenomenon in lowland rivers today. Years in which IP did not appear at all in the Noteć River have also been highlighted, and these are indicated in the presently analyzed observation series (1987–2013) by the large number of zeroes. The structure of the analyzed data series—that contained, on the one hand, information about the number of days with icing, and on the other hand, zeros that pointed to the absence of the phenomenon (a considerable dispersion of data with zero inflation)—led us to adopt both the negative binomial model and the zero-inflated binomial model. The correctness of this selection for analyses of IP change tendencies was confirmed by the Vuong test. It was assumed that the process governing the number of occurrences of a given phenomenon is accompanied by a dichotomous process that determines whether a phenomenon has a chance of occurring in a specific year. Already in the years 1878–1934, the number of days without icing in the Noteć River gradually increased, while the lack of stable IC became steadily more frequent [52]; today, this was also demonstrated by observations conducted on the river by the IMGW-PIB (Warsaw, Poland) (Figure 2).

Numerous studies have stressed that changes in the RI regime are the result of warmer winters, a fact that corresponds well with the positive TA trend in the cool half-year period [14,54–56]; this may, in consequence, translate into positive change tendencies of TW and the disappearance of periods of icing [4,6,16,17,51,57,58]. In the case of the Noteć River, no identical models of the tendencies of the occurrence of IP in the researched period were obtained. This is further confirmed by research into periods of icing in other European rivers, for which no clear direction of change or statistically significant trends have been determined [28,59]. In the temperate climate zone, the RI process tends to intensify in periods that are at least very cool. The formation of stable ice cover is facilitated by days that are very frosty ($t < -10$ °C) or with a strong frost ($t < -20$ °C) [23], the occurrence of which is connected with high-pressure weather that ensures the advection of dry and cool continental air masses from the eastern sector [56,60,61]. The impact of changes in global TA on the long-term fluctuations of the dates of formation and disappearance of IC is characterized by spatial heterogeneity [62,63], which means that in individual regions, change trends that are either positive or negative occur [26]. On the whole, the increase in TA and TW in the cool half-year period of the year impacts, among others, the later appearance and earlier disappearance of IP in rivers and, thus, the shortening of the duration of icing. According to Yang et al. [7], the duration of RI is shortened most greatly in the Rocky Mountains, in the north-eastern part of the United States, and in Eastern Europe.

For all water gauges on the Noteć River, the analysis resulted in the development of an identical model of change tendencies for SI; this is the first—next to FI—symptom of icing that forms near river banks as a uniform ice structure that reaches out towards the middle of the river as icing progresses. It is typical of the conditions of insufficient water cooling and calm flow and, thus, of the months of November and December. In all cases analyzed in the study, there was noticeable an initial increase in the number of days with SI, where after, in the second half of the period, the number of occurrences started to fall. TA turned out to be the best estimator for forecasting SI. Because of the negative trend obtained for zeroes in the forecasts, we should assume that it is probable that the occurrence of SI will increase in future. Over a longer period of observation, it was determined that phenomena from the first RI cycle (SI and FI) are dominant in the Noteć River, while stable IC occurs less frequently. Regarding FI, the statistical significance of specific change trends of its occurrence was not confirmed, which may have been due to the nature of its connection with TW (positive impact) and TA (negative impact). This form of icing requires considerable water overcooling [21,23] and the effective discharge

of solidification heat. It forms particularly plentifully in the presence of strong, cold winds, even if the decrease in TA is only slight (even at temperatures only a few degrees below 0 °C), which may usually be determined during its first, slight decreases at the beginning of the hydrological year (in November and December). At present, this predominance of the duration of phenomena from the first RI phase in relation to the duration of stable IC is a typical feature of the ice regime of the majority of rivers in Poland [21,22,24,25,31,42,51–53,64,65] and other countries of Europe [5,13,66,67].

In the case of lowland rivers, among which the Noteć River is classified, the phase of IC development is the longest, due to only slight flows and drifts [22,24,53,65], while its formation is facilitated by the long-term persistence of negative TA. The models utilized in the study have demonstrated that the best predictor for forecasting trends of occurrence of IC is TA. Research conducted by Graf and Tomczyk [23] confirmed that ice cover appears on the Noteć River at certain specific threshold values of accumulated negative TA (so-called degree-days), which are different for individual water gauges and equal to −16 °C for NP (upper course), −21 °C for NU (middle course) and NK, and −73.5 °C for ND (the last two stations are situated on the lower course of the river). The more rapid increase in cumulative series of negative TA contributes to an increase in the probability of occurrence and persistence of IC on the Noteć River, though it varies along its course. On average, an increase of one degree-day contributes to an increase in the chance of appearance of stable IC of approximately 1.5% (NU), 2–3% (NP, NK), and 6.0% (ND) [23].

The period of disappearance of stable IC due to the increase in TA occurs in the river in stages, in consequence of which FoI that moves downriver is created; this is known as the period of “ice movement” (drifting of ice) [32,42,52,53]. The drifting of FoI in the Noteć River is usually accompanied by FI and SI phenomena, for which a tendency analysis did not demonstrate a systematic time trend nor confirm the statistical significance of individual predictors. The FoI phenomenon very rarely occurs in the river, while its drift is usually accelerated by the break-up of IC caused by the augmentation of the water level in spring. The accumulation of a considerable quantity of FoI along a small section of the river may lead to the formation of IJ and thus to ice jam flooding [58,68], which, in the case of the Noteć River, is recorded along its middle and lower course (NU and NK water gauges). The phenomenon of IJ in the Noteć River, similarly to FoI, is extremely rare, with the last such occurrence taking place in 2010.

Far-reaching modifications of ice regime features have been indicated by research conducted into the nature and time of occurrence of IP in European rivers for the period of the last four decades [4,16,19,20]. The majority of authors have focused on an assessment of change tendencies at the start and end dates of RI and its duration, which, in light of the recorded increase in TA and TW, usually gives a result pointing to the shortening thereof. Apart from warmer winters, an increase in TA in the autumn and spring periods has also been noticeable, especially during the last twenty years of the 20th century but in recent decades as well [38,39,69–72], which delays the date of appearance of IP in rivers and also accelerates their disappearance. Analyses conducted for the last five-to-six decades in Polish rivers [21,22,24,25,31,42,51,64,65,73–75] have confirmed that the duration of IP has been shortened, though their respective change trends have differed along individual river sections. These studies indicated that an increase in TA and TW in the winter hydrological half-year period, which usually corresponds well with the negative IP duration trend, was connected with the variability of atmospheric circulation. In their research on the time of formation and disappearance of ice cover in the rivers Vistula and Niemen, Ćmielewski and Grześ [64] showed that the correlation between air temperature and data concerning the formation and disappearance of IC explains approximately 35–40% of the variability of these phenomena. Marszelewski and Pawłowski [51] confirmed a strong correlation (R^2 from 0.69 to 0.81) between the duration of ice phenomena in the Oder River and the mean air temperature in winter (1956–2015). During the indicated period, the duration of all ice phenomena decreased (by up to 0.58 days·year^{−1}), as did the duration of ice cover (by up to 0.46 days per year^{−1}). In turn, Wolski et al. [76] showed that during the multi-annual period of 2006–2017,

the number of days with an SI occurrence greater than the average could be observed in the middle of the Odra River.

An analysis of circulatory determinants impacting the occurrence of IC in the Noteć River was performed by Graf and Tomczyk [23], while an assessment of the relationship between the TW of Polish rivers and large-scale atmospheric circulation, which was accompanied by the disclosure of TW change patterns in Poland, was carried out by Graf and Wrzesiński [38,39] and Marszelewski and Pius [71,72]. Research conducted by Yoo and D'Odorico [5] in Northern Europe showed that the ice regime of surface waters is connected with changes in the North Atlantic Oscillation (NAO) index, the features of which confirm long-term climate change [16]. The increase in cyclonic activity, caused by (among others) a percentage increase in the positive NAO phase [77], results in warmer winters that start at a later date and are followed by early springs. The increase in the positive phase of the NAO that occurred in 1987–1989 has led to a considerable decrease in the severity of winters in Poland after 1989 [78]. This may have far-reaching consequences for the thermal and ice regimes of rivers, including the Noteć River. Climate changes have resulted in an increase in the frequency of the occurrence of mild winters, low snowfall, and frequent mid-winter thaws in the moderate climate zones [4,57]. The research on the periods of the formation and disappearance of IC in the Vistula and Niemen rivers has shown that the correlation coefficient of the dates of the IC break-up with the NAO index allows for the explanation of about 30% of changes in RI [64]. In the case of the Odra River, it was found that correlation between the duration of ice phenomena and the NAO index (R^2 from 0.42 to 0.48) was weaker than between the duration of ice phenomena and the mean air temperature in winter [51]; the pollution of the Oder River and icebreaking operations on the river were identified as the possible causes. In Poland, the strongest impact on river water temperature in winter (1971–2015) was observed for the positive and negative phases of NAO and AO, when deviations of water temperature from average values were correspondingly higher (by 0.6–1.0 °C) and lower (by 0.4–1.5 °C) [38]. The results indicated that relationships between the temperature of river water and macroscale types of atmospheric circulation are less obvious than in the case of air temperature.

In the case of the Noteć River, which drains the western part of the Polish Lowlands, TW change tendencies in the cool half-year period (1987–2013) were varied in comparison with the negative TA trend—negative in the upper and lower course of the river (NP and ND water gauges) and slightly positive in the middle course (NU water gauge). The results of studies have pointed to the complexity of processes determining the thermal regime of rivers and confirm the impact of additional factors, regional and local, on their temporal and spatial variability. Spatial differences between thermal regime features are typical of rivers with a marked seasonality of supply in the temperate climate [39,59,71,72]. At the same time, no single trend attained statistical significance at the level of individual decades, which may have been due to either of two reasons: obviously, trends for decades were analyzed on the basis of a smaller quantity of data, which automatically translated into lower strength, or the observed growth trend may have been unclear over short periods of time in comparison with random fluctuations. The IP change tendencies for the Noteć River are, to varying degrees, controlled by physical factors, such as TA and TW, and that the effect of the trend for the number of their occurrences is an important predictor that is especially visible in the upper course of the river (NP water gauge). TW turned out to be a significant estimator in the middle and lower course of the river (NU and ND water gauges). This shows that in order to obtain a precise IP forecast, it is necessary to take temporal trend models and models of changes in TA and TW over time into consideration.

Of considerable importance for the persistence of IP in the Noteć River is the transfer of thermal energy, which may occur on two levels: air–water and river bed–water [32]. The process of icing of flowing water commences when TA falls below 0 °C, consequently leading to a decrease of TW. Research into small water courses has shown that TA is the main predictor of changes in their TW [79,80], while the strongest connection occurs between them at equilibrium temperature, which arises when the exchange of heat between air and water is equal to zero [81]. The greatest differences in the intensity of the strength of correlation between TW and TA appear at extremely low values of TA in winter,

when TW does not fall below 0 °C and, thus, at the time when IP form and persist in rivers. However, the impact of TA on the thermal characteristics of waters in the majority of rivers is not spatially identical, and the effects frequently differ at various locations, which has also been confirmed by studies performed on the Noteć River. Furthermore, the strength of correlation between TW and TA fluctuates over the year, and relationships may change seasonally depending, for example, on the flow and quantity of subterranean supply; this has been documented in numerous stream temperature models [59,82,83]. Higher temperatures of river water in the winter season, in excess of 2.0 °C, usually point to the presence of pollutants in the river [84,85]. Pollutants have been channeled to the Noteć River for many years, including municipal wastewater from various towns and cities and water from coal mines (from the Konin region) [40]. The thermal and ice regime of the Noteć River has also been strongly modified due to the anthropogenic transformation of the bed and valley of the water-course. In the case of the Noteć River, these are most frequently regulatory activities that lead to changes in bed morphology and the artificial control of water flow [41]. This may impact variations in measurement series of river water temperatures [40], which brings about their instability and, in consequence, changes in ice regime [24].

6. Conclusions

1. The performed analysis has demonstrated clear fluctuations in the occurrence of IP in the Noteć River for the multi-annual period of 1987–2013, which is typical of rivers located in the temperate climate zone. In recent decades, the total lack of icing or periodic changes in its intensity has been observed with a greater frequency, and this holds true for the majority of rivers on the European Lowland, also in Poland. It has been determined that IP in Noteć River occur irregularly and periodically, on average from 21 to 40 days per year, while the RI structure along the river course is very diverse and is dominated by the ice phenomena from the first river freezing phase (SI and FI) and a constant IC. Meanwhile, the ice phenomena from the final icing stage, i.e., the disintegration of the IC and the appearance of FoI, occur least frequently. A particular intensification of IP in the river occurred in the decades 1990–2000—mainly in 1996 and 1997 (their number exceeded 50–100 days in a year)—and in 2001–2010 (mainly in 2006).

2. The analysis performed in order to estimate the IP trends change in the Noteć River has demonstrated a diversified share of the positive and negative trends in the studied time series. An analysis of the average annual TA and TW trends in the Noteć River for the whole multi-annual period and its individual decades have disclosed no significant differences. In the upper course of the river (NP water gauge), a slight decreasing tendency of TW (−0.19 °C) was determined when compared with the growth tendency of TW at the remaining stations (from 0.25 to 0.78 °C). In the cold half-year period (1987–2013), the TW change tendencies in comparison with the TA trend—that totaled −0.82 °C during the whole analyzed period—tended to vary from 0.84 °C (in the upper course) and a slightly positive trend in the middle course of the river to −0.52 °C (in the lower course).

3. The more rapid increase in the cumulative series of negative TA in the Noteć River catchment area contributes to an increase in the probability of occurrence and persistence of IC in that river. However, it is varied along its course (one degree-day contributes to an increase in the chance of appearance by about 1–6%). The probability of occurrence of ice cover depends on the length of time with the advection of cool air masses and, thus, on the duration of the period in which a given type of atmospheric circulation occurs in winter. The negative temporal trend obtained in the zero-inflated model was statistically significant or on the threshold of significance, and this would suggest that in the successive years the probability of IP occurrence may be steadily greater; however, this effect is weak. The result concerned, in particular, phenomena from the first phase, i.e., river freezing (SI). This confirms that in the near and distant future, these may be the only (or predominant) forms of icing in the Noteć River. The analysis has demonstrated the identical model of change tendencies for SI for all water gauges on the Noteć River—there was a noticeable initial increase in the number of days with SI; in the second half of the period the number of occurrences started to fall, and TA turned out to be

the best estimator of the observed change. Regarding FI, the statistical significance of specific change trends of its occurrence has not been confirmed, which may be due to the nature of its connection with TW (positive impact) and TA (negative impact).

4. In some of the water gauges, the number of IP occurrences and the annual probability of occurrence were not dependent on thermal conditions, and they were not governed by any systematic trends. This situation may be associated with different nature of relationships existing between TW and TA in autumn (beginning of IP) and spring (the disappearance of icing). Furthermore, in winter, due to the occurrence of RI, the heat transfer relationships between air and water are changing. The inclusion of annual fluctuations and trends of TA or TW makes it possible to improve the estimation process of the level of occurrence and change in the IP trends, which has been demonstrated by the analysis carried out for the Noteć River. The results of research confirm the effectiveness of compiling a few models that are based on sizes with excessive dispersion and zero inflation for the estimation of IP trends in a river. It should be noted that a time trend is a significant estimator for the number of occurrences of days with specific IP in a river.

5. The observed tendencies of change in components of the icing regime of the Noteć River have only been partially confirmed in the recorded winter TA and TW trends. These are frequently observed in rivers that have a distinct seasonality of water supply and are subjected to anthropogenic pressure. In its middle reaches, the Noteć River is canalized and accessible by ships, while its water levels are regulated by a sluice system that probably affects the irregularity of the IP occurrence. The anthropogenic factors have a varying intensity of influence in the catchment area of the Noteć River. The influx of pollutants into the river has been documented in earlier studies, but it was not confirmed by direct analysis of correlations of water temperature, IP, and wastewater [23,40]. This topic was not discussed in this paper due to the lack of adequate data to investigate such relationships.

The results obtained in this study indicate that despite common warming patterns, the individual features of rivers (hydrologic, thermal, morphological, and those associated with human impact) that are identified along its respective courses may determine the pace and future directions of change in the IP occurrence. They also constitute an important source of information for modelling studies and forecasts that provide valuable results that can be applied to water resource management in the periods of, for example, total RI and its consequences (e.g., the rapid drifting and accumulation of FOI and the formation of ice jams and occurrence of ice jam flooding), which are dangerous from the point of view of water management and undesirable for the biotic environment and ecological state of river water.

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References

1. Prowse, T.D.; Culp, J.M. Ice: Breakup: A neglected factor in river ecology. *Can. J. Civ. Eng.* **2003**, *30*, 128–144. [[CrossRef](#)]
2. Allan, J.D.; Castillo, M.M. *Stream Ecology: Structure and Function of Running Waters*, 2nd ed.; Chapman and Hall: New York, NY, USA, 2007. [[CrossRef](#)]
3. Borshch, S.V.; Ginzburg, B.M.; Soldatova, I.I. Modeling the development of ice phenomena in rivers as applied to the assessment of probable changes in ice conditions at various scenarios of the future climate. *Water Resour.* **2001**, *28*, 194–200. [[CrossRef](#)]
4. Prowse, T.D.; Bonsal, B.R.; Duguay, C.R.; Lacroix, M.P. River-ice break-up/freeze-up: A review of climatic drivers, historical trends and future predictions. *Ann. Glaciol.* **2007**, *26*, 443–451. [[CrossRef](#)]
5. Yoo, J.; D'Odorico, P. Trends and fluctuations in the dates of ice break-up of lakes and rivers in Northern Europe: The effect of the North Atlantic Oscillation. *J. Hydrol.* **2002**, *268*, 100–112. [[CrossRef](#)]

6. Bonsal, B.R.; Prowse, T.D.; Duguay, C.R.; Lacroix, M.P. Impacts of large-scale teleconnections on freshwater-ice break/freeze-up dates over Canada. *J. Hydrol.* **2006**, *330*, 340–353. [[CrossRef](#)]
7. Yang, X.; Pavelsky, T.M.; Allen, G.H. The past and future of global river ice. *Nature* **2020**, *577*, 69–73. [[CrossRef](#)] [[PubMed](#)]
8. Grześ, M.; Ćmielewski, M. Variability of ice phenomena in selected rivers of the Arctic in the 20th century. *Probl. Polar Climatol.* **2008**, *18*, 69–78. (In Polish)
9. Gebre, S.B.; Alfredsen, K.T. Investigation of river ice regimes in some Norwegian water courses. In Proceedings of the 16th Workshop on the Hydraulics of Ice Covered Rivers, Winnipeg, MB, Canada, 18–22 September 2011; CGU HS Committee on River Ice Processes and the Environment: Winnipeg, MB, Canada, 2011; pp. 1–20.
10. Beltaos, S. Climate impacts on the ice regime of an Atlantic river. *Nord. Hydrol.* **2004**, *35*, 81–99. [[CrossRef](#)]
11. Blenckner, T.; Järvinen, M.; Weyhenmeyer, G.A. Atmospheric circulation and its impact on ice phenology in Scandinavia. *Boreal Environ. Res.* **2004**, *9*, 371–380.
12. Vuglinskly, V.S.; Gronskaya, T.P. Changing of rivers and lakes ice regime within the Russian territory and their possible consequences for economy. In *Modern Problems of Hydrometeorology*; Asterion: St. Petersburg, Russia, 2006; pp. 229–245.
13. Kuusisto, E.; Elo, A.R. Lake and river ice variables as climate indicators in Northern Europe. *Verh. Int. Ver. Limnol.* **2000**, *27*, 2761–2764. [[CrossRef](#)]
14. Magnuson, J.J.; Robertson, D.M.; Benson, B.J.; Wynne, R.H.; Livingstone, D.M.; Arai, T.; Assel, R.A.; Barry, R.G.; Card, V.; Kuusisto, E.; et al. Historical trends in lake and river ice cover in the Northern Hemisphere. *Science* **2000**, *289*, 1743–1746. [[CrossRef](#)] [[PubMed](#)]
15. Sagarin, R.; Micheli, F. Climate change in nontraditional data sets. *Science* **2001**, *294*, 5543. [[CrossRef](#)] [[PubMed](#)]
16. Beltaos, S.; Prowse, T.D. River-ice hydrology in a shrinking cryosphere. *Hydrol. Process.* **2009**, *23*, 122–144. [[CrossRef](#)]
17. Bennett, K.E.; Prowse, T.D. Northern Hemisphere geography of ice-covered rivers. *Hydrol. Process.* **2010**, *24*, 235–240. [[CrossRef](#)]
18. Ćmielewski, M. The freezing variability of the northern hemisphere rivers in the XX century. In *II Workshops: Ice Problems of the Rivers “Congestion and High Water Jam” Abstracts of Lectures*; Nicolaus Copernicus University: Toruń, Poland, 2010; pp. 16–17. (In Polish)
19. Prowse, T.D.; Bonsal, B.R.; Duguay, C.R.; Hessen, D.O.; Vuglinsky, V.S. River and lake ice. In *Global Outlook for Ice and Snow*; United Nations Environment Programme (UNEP): Nairobi, Kenya, 2007; pp. 201–213.
20. European Environment Agency EEA. RReport No 12/2012. Climate Change, Impacts and Vulnerability in Europe 2012en. 2012. Available online: <http://www.eea.europa.eu/pl/themes> (accessed on 10 July 2020).
21. Graf, R. Variations of the thermal conditions of the Warta in the profile connecting the Urstromtal and gorge sections of the valley (Nowa Wieś Podgórna-Śrem-Poznań). In *Nowoczesne Metody I Rozwiązania W Hydrologii I Gospodarce Wodnej*; Absalon, D., Matysik, M., Ruman, M., Eds.; Komisja Hydrologiczna PTG, PTG Oddział Katowice: Katowice, Poland, 2015; pp. 177–194. (In Polish)
22. Graf, R.; Łukaszewicz, J.T.; Jawgiel, K. The analysis of the structure and duration of ice phenomena on the Warta river in relation to thermic conditions in the years 1991–2010. *Woda Środowisko Obsz. Wiej.* **2018**, *18*, 5–28. (In Polish)
23. Graf, R.; Tomczyk, A.M. The impact of cumulative negative air temperature degree-days on the appearance of ice cover on a river in relation to atmospheric circulation. *Atmosphere* **2018**, *9*, 204. [[CrossRef](#)]
24. Graf, R.; Łukaszewicz, J.T.; Jawgiel, K. Ice phenomena. In *Waters of Wielkopolska. Surface Waters. Rivers*; Choiński, A., Ed.; SERIA GEOGRAFIA NR 103; Wydawnictwo Naukowe UAM: Poznań, Poland, 2019; pp. 186–226. (In Polish)
25. Łukaszewicz, J.; Graf, R. The variability of ice phenomena on the rivers of the Baltic coastal zone in the Northern Poland. *J. Hydrol. Hydromech.* **2020**, *68*, 38–50. [[CrossRef](#)]
26. Kalinin, V.G.; Chichagov, V.V. The study of long-term fluctuations in the dates of ice formation and ice destruction in the rivers of the Votkinsk reservoir catchment. In *Modern Problems of Reservoirs and Their Catchments, IOP Conf. Series: Earth and Environmental Science*; IOP Publishing: Bristol, UK, 2019; Volume 321, p. 012028.
27. Efremova, T.V.; Pal’shin, N.I. Ice Phenomena Terms on the Water Bodies of Northwestern Russia. *Russ. Meteorol. Hydrol.* **2011**, *36*, 559–565. [[CrossRef](#)]

28. Arctic Monitoring and Assessment Programme AMAP. *Snow, Water, Ice and Permafrost in the Arctic. Summary for Policy-Makers. Climate Change and the Cryosphere*; Arctic Monitoring and Assessment Programme (AMAP): Oslo, Norway, 2011; Available online: <https://www.amap.no/documents/doc/snow-water-ice-and-permafrost-in-the-arctic-swipa-climate-change-and-the-cryosphere/743> (accessed on 10 July 2020).
29. Cheng, B.; Vihma, T.; Launiainen, J. Modelling of the superimposed ice formation and sub-surface melting in the Baltic Sea. *Geophysica* **2003**, *39*, 31–50.
30. Frauenfeld, O.W.; Zhan, T.; McCreight, J.L. Northern Hemisphere freezing/thawing index variations over the twentieth century. *Int. J. Climatol.* **2007**, *27*, 47–63. [[CrossRef](#)]
31. Majewski, W.; Mroziński, Ł. Ice phenomena on the Lower Vistula. *Gospod. Wodna* **2010**, *1*, 18–22. (In Polish)
32. Caissie, D. The thermal regime of rivers: A review. *Freshw. Biol.* **2006**, *51*, 1389–1406. [[CrossRef](#)]
33. Toffolon, M.; Siviglia, A.; Zolezzi, G. Thermal wave dynamics in rivers affected by hydropeaking. *Water Resour. Res.* **2010**, *46*, W08536. [[CrossRef](#)]
34. Van Vliet, M.T.H.; Ludwig, F.; Zwolsman, J.J.G.; Weedon, G.P.; Kabat, P. Global river temperatures and sensitivity to atmospheric warming and changes in river flow. *Water Resour. Res.* **2011**, *47*, W02544. [[CrossRef](#)]
35. Luo, Y.; Ficklin, D.L.; Liu, X.; Zhang, M. Assessment of climate change impacts on hydrology and water quality with a watershed modeling approach. *Sci. Total Environ.* **2013**, *450–451*, 72–82. [[CrossRef](#)]
36. Caldwell, P.; Segura, C.; Laird, S.G.; Sun, G.; McNulty, S.G.; Sandercock, M.; Boggs, J.; Vose, J.M. Short-term stream water temperature observations permit rapid assessment of potential climate change impacts. *Hydrol. Process.* **2015**, *29*, 2196–2211. [[CrossRef](#)]
37. Olsson, T.; Jakkilä, J.; Veijalainen, N.; Backman, L.; Kaurola, J.; Vehviläinen, B. Impacts of climate change on temperature, precipitation and hydrology in Finland—Studies using bias corrected regional climate model data. *Hydrol. Earth. Syst. Sci.* **2015**, *19*, 3217–3238. [[CrossRef](#)]
38. Graf, R.; Wrzesiński, D. Relationship between Water Temperature of Polish Rivers and Large-Scale Atmospheric Circulation. *Water* **2019**, *11*, 1690. [[CrossRef](#)]
39. Graf, R.; Wrzesiński, D. Detecting Patterns of Changes in River Water Temperature in Poland. *Water* **2020**, *12*, 1327. [[CrossRef](#)]
40. Graf, R. Distribution properties of a measurement series of river water temperature at different time resolution levels (Based on the example of the Lowland River Noteć, Poland). *Water* **2018**, *10*, 203. [[CrossRef](#)]
41. Wrzesiński, D.; Sobkowiak, L. Detection of changes in flow regime of rivers in Poland. *J. Hydrol. Hydromech.* **2018**, *66*, 55–64. [[CrossRef](#)]
42. Pawłowski, B.; Gorączko, M.; Szczerbińska, A. Zjawiska lodowe na rzekach w Polsce [Ice phenomena in Polish rivers]. In *Hydrologia Polski*; Jokieli, P., Marszelewski, W., Pociask-Karteczka, J., Eds.; Wydawnictwo Naukowe PWN: Warszawa, Poland, 2017; pp. 195–200.
43. Ljung, G.M.; Box, G.E.P. On a Measure of Lack of Fit in Time Series Models. *Biometrika* **1978**, *65*, 297–303. [[CrossRef](#)]
44. Mullahy, J. Specification and Testing of Some Modified Count Data Models. *J. Econom.* **1986**, *33*, 341–365. [[CrossRef](#)]
45. Lambert, D. Zero-Inflated Poisson Regression, with an Application to Defects in Manufacturing. *Technometrics* **1992**, *34*, 1–14. [[CrossRef](#)]
46. Vuong, Q.H. Likelihood Ratio Tests for Model Selection and non-Nested Hypotheses. *Econometrica* **1989**, *57*, 307–333. [[CrossRef](#)]
47. Wilson, P. The misuse of the Vuong test for non-nested models to test for zero-inflation. *Econom. Lett.* **2015**, *127*, 51–53. [[CrossRef](#)]
48. Yue, S.; Pilon, P.; Phinney, B.; Cavadias, G. The influence of autocorrelation on the ability to detect trend in hydrological series. *Hydrol. Process.* **2002**, *16*, 1807–1829. [[CrossRef](#)]
49. Sen, P.K. Estimates of the regression coefficient based on Kendall's tau. *JASA* **1968**, *63*, 1379–1389. [[CrossRef](#)]
50. R Core Team. *R: A Language and Environment for Statistical Computing*; R Foundation for Statistical Computing: Vienna, Austria, 2013; Available online: <http://www.R-project.org> (accessed on 20 May 2020).
51. Marszelewski, W.; Pawłowski, W. Long-Term Changes in the Course of Ice Phenomena on the Oder River along the Polish—German Border. In *Water Resources Management: An International Journal, Published for the European Water Resources Association (EWRA)*; Springer: Berlin, Germany, 2019; Volume 33, pp. 5107–5120.
52. Paczoska, Z. Freezing of rivers in Poland. *Geogr. Res.* **1937**, *18–19*, 29–69. (In Polish)
53. Gołek, J. *Ice Phenomena on Polish Rivers*; PIHM, WKiŁL: Warsaw, Poland, 1957.

54. Agafonova, S.A.; Frolova, N.L. Features of ice regime of Northern Dvina Rivers' basin. *Water Resour. J.* **2007**, *34*, 123–131. (In Russian) [[CrossRef](#)]
55. Klavins, M.; Briede, A.; Rodinov, V. Long term changes in ice and discharge regime of rivers in the Baltic region in relation to climatic variability. *Clim. Chang.* **2009**, *95*, 485–498. [[CrossRef](#)]
56. Przybylak, R. Changes in Poland's climate over the last millennium. *Czas. Geogr.* **2011**, *82*, 23–48.
57. Dibike, Y.; Prowse, T.; Saloranta, T.; Ahmed, R. Response of Northern Hemisphere lake-ice cover and lake-water thermal structure patterns to a changing climate. *Hydrol. Process.* **2011**, *25*, 2942–2953. [[CrossRef](#)]
58. Lindenschmidt, K.E.; Carstensen, D.; Fröhlich, W.; Hentschel, B.; Iwicki, S.; Kögel, M.; Kubicki, M.; Kundzewicz, Z.W.; Lauschke, C.; Łazarów, A.; et al. Development of an ice jam flood forecasting system for the Lower Oder River: Requirements for real-time predictions of water, ice and sediment transport. *Water* **2019**, *11*, 95. [[CrossRef](#)]
59. Webb, B.W.; Nobilis, F. Long-term changes in river temperature and the influence of climatic and hydrological factors. *Hydrol. Sci. J.* **2007**, *52*, 74–85. [[CrossRef](#)]
60. Ustrnul, Z.; Czekierda, D.; Wypych, A. Extreme values of air temperature in Poland according to different atmospheric circulation classifications. *Phys. Chem. Earth* **2010**, *35*, 429–436. [[CrossRef](#)]
61. Tomczyk, A.M.; Bednorz, E. Heat and cold waves on the southern coast of the Baltic Sea. *Baltica* **2014**, *27*, 45–54. [[CrossRef](#)]
62. Ginzburg, B.M.; Soldatova, I.I. Long-term fluctuations in terms of freezing and opening of rivers in various geographical areas. *Meteorol. Gidrol.* **1996**, *6*, 101–108. (In Russian)
63. Frolova, N.; Agafonova, S.; Nesterenko, D. Water and ice regimes of the rivers of European Russia under climate change. In *Hydro-Climatology: Variability and Change, Proceedings of the Symposium J-H02 held during IUGG2011, Melbourne, Australia, 28 June–7 July 2011*; IAHS: Wallingford, UK, 2011; p. 344. Available online: <https://iahs.info/uploads/dms/16763.14-63-68-344-39-Frolova--Agafonova---Nesterenko.pdf> (accessed on 20 June 2020).
64. Ćmielewski, M.; Grześ, M. Perennial variability of the Vistula freezing process in Toruń and Niemen in Smolniki in the 19th and 20th centuries. *Gospod. Wodna* **2010**, *3*, 112–115. (In Polish)
65. Bączyk, A.; Suchożebrski, J. Variability of ice phenomena on the Bug River (1903–2012). *Inżynieria Ekol.* **2016**, *49*, 136–142. (In Polish) [[CrossRef](#)]
66. Woolway, R.I.; Dokulil, M.T.; Marszelewski, W.; Schmid, M.; Bouffard, D.; Merchant, C.J. Warming of Central European lakes and their response to the 1980s climate regime shift. *Clim. Chang.* **2017**, *142*, 505–520. [[CrossRef](#)]
67. Maberly, S.C.; O'Donnell, R.A.; Woolway, R.I.; Cutler, M.E.J.; Gong, M.; Jones, I.D.; Merchant, C.J.; Miller, C.A.; Politi, E.; Scott, E.M.; et al. Global lake thermal regions shift under climate change. *Nat. Commun.* **2020**, *11*, 1232. [[CrossRef](#)] [[PubMed](#)]
68. Savichev, O.G.; Tarasov, A.; Zemtsov, V.A. Assessment methodology for the backwater levels caused by ice jams: A case study of the rivers of Tom and Chulyum (the Ob River drainage basin, Western Siberia, Russia). *Earth Environ. Sci.* **2019**, *400*, 012005. [[CrossRef](#)]
69. Kozuchowski, K.; Żmudzka, E. Warming in Poland: Scale and seasonal distribution in changes of air temperature in the second half of 20th century. *Przegląd Geofiz.* **2001**, *46*, 81–90. (In Polish)
70. Kundzewicz, Z.W. Climate changes, their reasons and effects—Observations and projections. *Landf. Anal.* **2011**, *15*, 39–49.
71. Marszelewski, W.; Pius, B. Long-term changes in temperature of river waters in the transitional zone of the temperate climate: A case study of Polish rivers. *Hydrol. Sci. J.* **2016**, *61*, 1430–1442. [[CrossRef](#)]
72. Marszelewski, W.; Pius, B. Relation between air temperature and inland surface water temperature during climate change (1961–2014): Case study of the Polish Lowland. In *Water Management and the Environment: Case Studies*; Zelenakova, M., Ed.; Springer: Berlin, Germany, 2018; pp. 175–195.
73. Kornaś, M. Ice phenomena in the Warta River in Poznań in 1961–2010. *Quaest. Geogr.* **2014**, *33*, 51–59. [[CrossRef](#)]
74. Pawłowski, B. Determinants of change in the duration of the ice phenomena on the Vistula River in Toruń. *J. Hydrol. Hydromech.* **2015**, *63*, 145–153. [[CrossRef](#)]
75. Pawłowski, B. *Course of Ice Phenomena on the Lower Vistula River in 1960–2014*; Nicholas Copernicus University: Toruń, Poland, 2017. (In Polish)

76. Wolski, K.; Tyimiński, T.; Głuchowska, B. Analysis of ice phenomena hazard on the middle Odra river. *Land Reclam. Ser. Ann. Wars. Univ. Life Sci.* **2017**, *49*, 301–314. [[CrossRef](#)]
77. Hurrell, J.W. Decadal Trends in the North Atlantic Oscillation: Regional Temperatures and Precipitation. *Science* **1995**, *269*, 676–679. [[CrossRef](#)]
78. Styszyńska, A.; Marsz, A. Mechanisms of Atmospheric Climate Change—The Problem of Modern Warming. In *Energy of the Future, Energy Saving Installations and Systems*; Kwiatkowski, Z.R., Ed.; INFOTECH: Gdańsk, Poland, 2015; p. 17.
79. DeWeber, J.T.; Wagner, T. A regional neural network ensemble for predicting mean daily river water temperature. *J. Hydrol.* **2014**, *517*, 187–200. [[CrossRef](#)]
80. Detenbeck, N.E.; Morrison, A.C.; Abele, R.W.; Kopp, D.A. Spatial statistical network models for stream and river temperature in New England, USA. *Water Resour. Res.* **2016**, *52*, 6018–6040. [[CrossRef](#)]
81. Bogan, T.; Mohseni, O.; Stefan, H.G. Stream temperature equilibrium temperature relationship. *Water Resour. Res.* **2003**, *39*, 1245. [[CrossRef](#)]
82. Van Vliet, M.T.H.; Franssen, W.H.P.; Yearsley, J.R.; Ludwig, F.; Haddeland, I.; Lettenmaier, D.P.; Kabat, P. Global river discharge and water temperature under climate change. *Glob. Environ. Chang.* **2013**, *23*, 450–464. [[CrossRef](#)]
83. Hocking, D.J.; O’Neil, K.; Letcher, B.H. A hierarchical model of daily stream temperature for regional predictions. *PeerJ Prepr.* **2018**, *6*, e27069v1.
84. Lowney, C.L. Stream temperature variation in regulated rivers: Evidence for a spatial pattern in daily minimum and maximum magnitudes. *Water Resour. Res.* **2000**, *36*, 2947–2955. [[CrossRef](#)]
85. Takács, K.; Nagy, B.; Kern, Z. Human Impacts on River Ice Regime in the Carpathian Basin. Available online: <http://meetingorganizer.copernicus.org> (accessed on 28 October 2019).

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