***Abstract*** – The thawing of permafrost in the northern hemisphere is considered a critical contributor to the characterisation of Earth’s climate. Though monitoring of ground temperature and thaw depth in permafrost cannot be directly observed from satellite sensors, recent models have achieved relatively accurate models through analysing a variety of remotely sensed data in order to indirectly derive permafrost characteristics. In this work, we aim to utilise these model’s results within a deep-learning regression model to propose correlations between the degradation of permafrost and the recent record high temperatures in Europe and particularly Spain. The correlations could support a ‘heater-cooler’ model, in which the shrinking and greening of the northern permafrost region – the ‘cooler’ - is leading to a reduced surface albedo that could impact atmospheric circulation. The weakening of the polar jet stream could lead to hot hair from the equator to push northwards - the ‘heater’. If this model were to be a factor in European temperatures it adds additional pressure to the already strained climate goals set out and could alter the results of climate no-return models.

**Introduction**

Permafrost is defined as ground (sediment, soil, or rock) that remains below 0°C for a minimum of two consecutive years [1]. Permafrost is a common cryosphere feature with 24% of exposed land on the northern hemisphere being underlain by permafrost [2]. The occurrence of permafrost is strongly influenced by air temperature, topography, hydrology, snow depth and soil properties, and the decline of permafrost extent over the last 30 years indicates its vulnerability to climate change [14]. The thawing of permafrost is a major threat to local infrastructure and the roughly 5 million people that live in the Artic Circumpolar Permafrost Region (ACPR) [4]. 1 million of these inhabitants live along artic coastlines, which are being particularly affected by coastal erosion that is primarily driven by warming permafrost and sea temperatures [5], resulting in an increase in erosion rates by up to 160% on some coasts compared to the erosion rates in the 1980’s and 90’s [6]. Previous research has utilised machine learning frameworks exploiting C-band synthetic aperture radar and multi-spectral information to forecast that 55% of infrastructure currently on permafrost and within 100km of the arctic coastline will be affected by 2050 [7].  
The thawing of permafrost is also a major concern on a global scale due to the significant amount of greenhouse gasses contained within the frozen ground. Methane is stored in permafrost as either methyl clathrates or frozen organic matter, as the permafrost degrades, some of this methane is released into the atmosphere [8]. Methane is particularly damaging to the climate and is 28 times as potent as carbon dioxide at conserving heat in the atmosphere [9]. There is nearly twice the amount of carbon stored within permafrost as there is currently in our atmosphere - approximately 1460-1600 billion tonnes of organic carbon. On release, these gasses could accelerate the greenhouse effect resulting in more permafrost degradation leading to a positive feedback loop [10].

Despite the prevalence and global impact of permafrost thawing, it is only recently that the specifics and implications are being fully explored. The Intergovernmental Panel on Climate Change’s (IPCC) 2014 assessment did not take permafrost emissions into account when calculating future temperature targets, and it was not until an IPCC special report in 2018 that a permafrost thawing model was used. The potential ramifications of permafrost degradation appear profoundly underrepresented and new tools, methodologies and satellite data (e.g. Google Earth Engine, deep learning and the Methane Remote Sensing LiDAR Mission [12]) have created a unique opportunity to further investigate its global effects. The Remote sensing of permafrost is a challenging but advancing endeavour, some below-surface characteristics of permafrost, such as thaw depth, are hard to reliably detect remotely [11]. This is partly due to additional factors, such as soil texture, surface roughness, snow and vegetation which influence signals. However, progress has been made through indirectly deriving permafrost states from other detectable characteristics, for example, identifying permafrost landforms through image classification and permafrost surface deformations by repeat digital elevation models, or radar interferometry [11]. Additionally, permafrost monitoring can become increasingly accurate by combining the information gathered from a multitude of sensors with thermal permafrost models to take advantage of the heterogeneity of permafrost[11].

The drastic changes in the permafrost regions have occurred alongside equally intense changes in Europe. Despite the European Environmental Agency (EEA) reporting that there has been a reduce in greenhouse emissions from EU members– 24% less emissions in 2021 than 1990 levels [15], temperatures in Europe have continued to rise faster than the world average [16]. The ‘Paris Agreement’ to limiting the global temperature increase to 1.5°C above pre-industrial levels is becoming ever more unlikely as several European countries have already reached this limit [16,17]. This is displayed in Spain where the average temperature had risen by 1.5°C since 1965 by 2015 and the country has experienced 24 heatwaves between 2010-202, double the amount of the previous decade [31] . The ten warmest years for Europe have occurred since 2000 [18]. The European climate is multifaceted, and cause/effects cannot be easily defined, this paper proposes one factor could be the regression of permafrost. While stored greenhouse gasses within thawing permafrost pose a massive climate threat [8,10], it has been argued that arctic permafrost is still a carbon sink – absorbing more carbon than it produces because of the plants present in the growing seasons [8]. However, as the permafrost warms it causes ‘greening’ [19]- plants are spreading into areas that were typically tundra and becoming denser across the arctic [20] (AS SHOWN IN FIGURE). This ‘greening’ is decreasing the surface albedo of the arctic; forests and taller vegetation is often much darker than sparse or shorter vegetation, especially in cases where the underlying surface is covered in snow [21] – as it often is in the permafrost zone. It has already been suggested that the lowering of albedo caused by sea ice melting could be affecting atmospheric circulation [22,23,24] as more shortwave radiation from the sun is absorbed into the water, warming and moistening the lower troposphere [22,23,24]. Similarly, changes in snow cover can impact low layers of the atmosphere, as more longwave radiation is emitted into the atmosphere when the surface albedo is decreased from sparser snow cover [25,26]. Given these two examples and the aforementioned rate of permafrost degradation, we propose that the warming of permafrost and the consequential ‘greening’ has the scale to also impact atmospheric circulation. This ‘heater-cooler’ model hypothesises that the global circulation of air which redistributes thermal energy and prevents the equator becoming increasingly hotter and the poles increasingly colder; is unbalanced by the rising temperatures in the arctic, of which one factor is the regression of permafrost. This could then be a factor in the extreme temperatures in Europe of which Spain is an example. A deep-learning regression model could be effective in identifying a correlation between the melting permafrost and high temperatures

* Correlation could be for several reasons, gasses released could cause heating however doesn’t explain why Spain is so inversely affected and there is research that the amount of vegetation increases which could partly counter the release of gasses at the moment [get REFERENCE]
* Heater-cooler model, changes in permafrost state could result in changes to atmospheric circulation effecting the temperatures in Europe. It has already been suggested that the in sea ice can affect atmospheric circulation as it declines the albedo also declines leading to absorption of additional solar energy [1,2,3]. The increase in absorbed shortwave radiation raises the temperature of the water warming and moistening the lower troposphere [3]. Similarly, changes in snow cover can also impact low layers of the atmosphere and in turn, atmospheric circulation. More longwave radiation is emitted to the atmosphere as a consequence of a decreased in snow cover causes a lower albedo [4,5].
* There is a positive relationship between warming permafrost and ‘greening’ [1] – the process of vegetation growing and becoming denser. THis. In the heater-cooler model, the ‘cooler’ is the northern hemisphere permafrost zone which is being altered
  + Role of Arctic sea ice in global atmospheric circulation: A Review (D.Budikova, 2009):  
    https://www.sciencedirect.com/science/article/pii/S0921818109000654?casa\_token=VRfWyjw4GAgAAAAA:Yd9rtg9xd-3i8sSzx\_fjHubp9pp9SdPyZchxAPggagT7WeLT\_8JTgZleOEEtjBCa-xisFwIbjYU#aep-section-id9
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  + A multi-data set analysis of variability and change in Arctic spring snow cover extent, 1967-2008 (R. Brown, C. Derksen, L. Wang, 2010):  
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* Intensified by
  + Northern Hemisphere Greening in Association with Warming Permafrost (X. Peng, T. Zhang, O.w. Frauenfeld, W. Shijin, L. Qiao, R. Du, C. Mu, 2020):  
    https://www.researchgate.net/publication/337207331\_Northern\_Hemisphere\_Greening\_in\_Association\_With\_Warming\_Permafrost
  + Quantifying Surface albedo and other direct biogeophysical climate forcings of forestry activities (R.M. Bright, K. Zhao, R.B. Jackson, F. Cherubini, 2015):  
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Text

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https://agupubs.onlinelibrary.wiley.com/doi/10.1029/2004RG000157#:~:text=Snow%20can%20be%20interrupted%20and,et%20al.%2C%202001%5D.

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**INSERT BIT ABOUT EUROPE TRMPERATURES ?**

* Rising Temperatures
  + Despite EEA recording a reduce in greenhouse gas emissions (24% below 1990 levels)[1], Temperatures in Europe are increasing faster than the world average with the 1.5C limit of global temperature increase above pre-industrial level already exceeded in some European cities [3] and the overall 2C limit set to be exceeded before 2050[2]
    - Trends and projections in Europe 2021 (European Environment Agency Report, 2021):  
      <https://www.eea.europa.eu/publications/trends-and-projections-in-europe-2021>
    - Global and European Temperatures – Climate-ADAPT (European Environment Agency , 2020):  
      <https://climate-adapt.eea.europa.eu/metadata/indicators/global-and-european-temperature>
    - Europe is getting warmer and it’s not looking like it’s going to cool down anytime soon (European Data Journalism Network, Nicolas Kayser-Bril, 2018):  
      https://www.europeandatajournalism.eu/eng/News/Data-news/Europe-is-getting-warmer-and-it-s-not-looking-like-it-s-going-to-cool-down-anytime-soon
* Number of records broken
  + The ten warmest years for Europe have occurred since 2000
    - Copernicus ECMWF Annual Findings (EUCCS, 2022):  
      https://climate.copernicus.eu/copernicus-globally-seven-hottest-years-record-were-last-seven
* Sahara Desert Expanding, climate staying the same?
* How does Sahara desert effect climate in Europe?

Through a deep learning regression model utilising air temperature climate data and permafrost variable data primarily derived from satellite measurements, we propose a possible correlation between ese extreme temperatures and the degradation of permafrost.

* Erosion, more water = warmer?

These advancements along with the European Space Agency Climate Change Initiative program (ESA CCI) adding permafrost as an ‘Essential Climate Variable’ (ECV) in 2018, have led to a surge of research in the field, with 62 articles on permafrost related satellite earth observation being published in 2018 compared to the 2 published in 2008 [12].

**Data**

The European Space Agency Permafrost Climate Change Initiative (ESA CCI) added permafrost as an ‘Essential Climate Variable’ (ECV) in 2018, since then the Permafrost CCI has developed and publicised permafrost maps primarily derived from satellite measurements as ECV products. The latest ESA CCI data products are selected for a deep-learning regression model because of the variety of data types, length of data and accuracy. The data that will be used for the model is: Ground Surface Temperature, Ground Temperature at 1m,2m,5m and 10m depth, Active Layer Thickness and Permafrost Extent. All the ESA CCI datasets are annual averages covering the northern hemisphere (north of 30°) from 1997-2019 with a spatial resolution of 926.63m. The thermal model is constrained by MODIS and downscaled ERA5 data [27]. It has been argued that only continuous and discontinuous permafrost can be identified by climate models due to coarse resolution [32], so only continuous permafrost data will be used from the Permafrost Extent database. Discontinuous permafrost cannot be used because it does not reliably depict trends as [SHOWN IN FIGURE} permafrost becomes sparser; the continuous permafrost becomes discontinuous, while discontinuous permafrost becomes sporadic, so the extent of discontinuous permafrost might remain the same despite changes. Additional monthly land surface temperature data for 2000-2010 is collected from the ESA Data User Element (DUE) Permafrost product set with a 25km spatial resolution. The ERA5 dataset is used to gather 2m air temperature monthly average information for Spain and any other countries at 0.25°x0.25° resolution [33].

Why just used continuous

Time & spatial

Why just using continuous not sparse

**Methodology**

The ESA CCI datasets were processed to retrieve annual average ground temperatures at the surface and 1m, 2m, 5m and 10m depth, average active layer thickness. The ESA CCI permafrost extent for the northern hemisphere was processed to obtain the percentage of observed sections that classify as continuous permafrost. According to the International Permafrost Association zonation: 90-100% permafrost underlain in an area distinguishes continuous permafrost . Outliers were defined as values more than three scaled median absolute deviations; this was particularly relevant for the active layer thickness dataset which has large deviations of several metres in extreme cases due to incorrect ground stratigraphies [27]. The 2m air temperature ERA5 monthly aggregates were collated in Google Earth Engine where country specific data was acquired by masking data not within the specified geometry. The geometry was defined by layering the FAO Global Administrative Unit Layers (GAUL) Country Boundaries dataset over the ERA5 dataset and filtering by GAUL country codes. To investigate correlation between permafrost state and European temperatures a deep-learning regression model is attempted with individual country max 2m air temperature as the target variable. Initial attempts at applying a deep learning model were constrained by the shortness of data with the ESA CCI only covering annual summaries from 1997-2019. Monthly land surface temperatures from the ESA data User Element (DUE) Permafrost full product set from 2000-2010 were considered in a pre-model process to understand the weighting of the ESA dataset parameters in relation to a smaller temporal resolution. This allowed an increase in the volume of data and allow the use of monthly 2m air temperature averages rather than annual. The data is first split into a training, validation and test sets which will be used for a holdout validation strategy [MAKE A DIAGRAM]. The architecture consists of an input layer composed of 27 dense input neurons. This is followed by two hidden layers with 50 neurons each which are Rectified Linear Unit (ReLU) activated. ReLU was chosen because of its effective gradient propagation with relatively sparse data and to avoid the ‘vanishing gradients problem’ [28]. The final layer is the output layer containing one neuron with a linear activation function. Weights are optimized over 10 epochs through a mini-batch gradient descent algorithm with a mini-batch size of 1 to account for the relatively small data size and to create a high model update frequency. The model aims to minimize error values that are calculated through a Mean Squared Error loss function (MSE). MSE was chosen because of its applicability to regression problems.

is a data point, is its predicted value and is the total number of data points.

Graph of holdout validation strategy

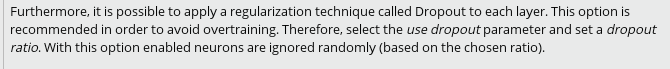
Graph of data stuff

Could still talk about smoothing (factor 50) in methodology

Talk about and show results of predictions non-extened

One-hot encoding

How cause & change is hard to prove so comparing results between other countries is important



**In Methodology can talk about getting the data like this:  
A picture containing text

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**Data handling and Visualisation little chapter at the end**

**Results & Discussion**

Due to the monthly temporal resolution of the DUE LST data in the pre-model study, a reasonably high correlation was expected on account of the natural oscillation of temperature over the months. This expectation proved correct with the overall correlation of permafrost factors: (monthly DUE Land Surface Temperature and Annual average active layer thickness, ground surface temperature, ground temperature at 1,2,5,and 10m depth, percentage of continuous permafrost) and the monthly max 2m air temperature in Spain being calculated as 0.847 +/- 0.066 with a relative error lenient of 9.26% +/-1.23%. Out of the variable factors, the DUE average LST was weighted the most (0.277), followed by the average ground temperature at the surface, d 5m depth and the active layer thickness. This is likely because the DUE LST data is monthly and therefore correlates more reliably with the monthly 2m air temperature in Spain. The active layer thickness was expected to be heavily weighted as it has long been a key indicator of permafrost state [8,9,11,13] and it’s allocated weight benefits the model’s accuracy. The temperature at 5m depth was unexpectedly heavily weighted, this could be because it fluctuates less than temperatures at a 1m and 2m depth but still represents trends more accurately than the temperature at 10m depth [SHOWN IN FIGURE]. While this model suggests a strong correlation between the temperatures in Spain and permafrost variables, the result on its own does not determine that the correlation isn’t a result of global warming affecting both areas, rather than one affecting the other. To understand the result in context, the 2m air temperatures of Ireland and Iceland were put through the regression model. The resultant overall correlation between the permafrost variables and the 2m air temperature in Ireland was 0.83 +/- 0.051, and even lower for Iceland: 0.828 +/- 0.049. The high latitude of both countries would suggest that they should be more consonant with the variables of permafrost, Iceland is at a higher latitude than some cases of continuous permafrost[2]. Additionally, Iceland and Ireland are exposed to arctic maritime air mass – air which is influenced by the underlying surface of the arctic which is predominately permafrost. Despite these influences, the 2m air temperature in Spain has a higher correlation with permafrost than that of Iceland and Ireland. This advocates that there is a link between the decrease in permafrost and the rising extreme temperatures in Europe, particularly prevalent in the south, as Spain exemplifies.

These results were considered in the regression model which considered the calculated weights of parameters to propose an equation to predict the max July temperatures in Spain with the degradation of permafrost from the ESA CCI dataset:

In which Average Active Layer Thickness (m), = Average Ground Temperature at 5m Depth (C°), = Percentage of observed Continuous Permafrost pixels (observed from north of 30° with a spatial resolution of 926.63m), = Average Ground Surface Temperature (C°) & = July 2m Air Temperature in Spain.  
The model performed

I propose that a factor behind the strong correlation between extreme temperatures in Spain and the reducing extent of permafrost can be defined within a ‘heater-cooler’ model in which the ‘cooler’ is the northern hemisphere permafrost that is in a rapid decline. The thawing of permafrost and subsequent ‘greening’ is causing a lower surface albedo which is reducing the amount of short-wave radiation being reflected. This could impact atmospheric circulation similarly to how changes in snow cover and sea ice do [22,23,24,25,26]. Consequently, the ‘heater’ – radiation absorbed from the Sun at the equator and circulated through the Hadley cell causing tropical rainforests and deserts – is not being balanced by the heat-release at the pole. One such way atmospheric circulation could be impacted is the lessening of the temperature difference between the Polar cell and Ferrel cell which weakens the Polar Jet stream and allows warmer air to push northwards [30]. Spain epitomises the drastic affects of extreme temperatures and desertification [31].  
Permafrost data is still too sparse and there are too many factors in air temperatures and global climates to be conclusive, but the information presented and developed in the deep-learning regression modes shows the need for further research and proposes a hypothesis of a potential global issue. Future projects such as phase 2 of the ESA CCI Permafrost data products might allow for further exploration of the topic by providing primarily satellite derived data of a greater accuracy and density.

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