

# An evaluation of persistent meteorological drought using a homogeneous Island of Ireland precipitation network

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# 21 Abstract

22 This paper investigates the spatial and temporal properties of persistent meteorological

- 23 droughts using the homogeneous Island of Ireland Precipitation (IIP) network. Relative to a
- 24 1961-1990 baseline period it is shown that the longest observed run of below average

25 precipitation since the 1850s lasted up to 5 years (10 half-year seasons) at sites in southeast

- and east Ireland, or 3 years across the network as a whole. Dry- and wet-spell length
- 27 distributions were represented by a first-order Markov model which yields realistic runs of
- 28 below average rainfall for individual sites and IIP series. This model shows that there is
- relatively high likelihood (p=0.125) of a 5 year dry-spell at Dublin, and that near unbroken
- 30 dry runs of 10 years or more are conceivable. We suggest that the IIP network and attendant
- 31 rainfall deficit modelling provide credible data for stress testing water supply and drought
- 32 plans under extreme conditions.

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- 34 *Key words*:
- 35 Drought duration; Markov model; homogeneous rainfall series; water planning; Ireland.
- 36

### 38 **1. Introduction**

39 Drought is hardly synonymous with perceptions about the climate of Ireland. Nonetheless, 40 the *Freeman's Journal*<sup>1</sup> provides numerous reports of potable water shortages in Dublin 41 during severe dry spells over the period 1763-1924 and Barrington (1888) gives a rich 42 account of impacts of the 1887 drought on Irish agriculture. Other notable events such as the 43 pan-European drought of 1976 caused heat- and moisture-stress-related problems for 44 Ireland's agricultural sector (Stead, 2014). Likewise, some future climate scenarios foresee 45 loss of production for crops such as potatoes linked to rising temperatures and summer aridity 46 (Holden *et al.*, 2003); reduced grass growth and heat stress on livestock which could impact 47 meat and dairy exports (Hunt et al., 2014); and decreased river flow in summer (Steele-48 Dunne et al., 2008; Bastola et al., 2011).

49 Given these vulnerabilities, surprisingly little has been published on the drought climatology

50 of Ireland. O'Laoghog (1979) provides a summary of rainfall anomalies alongside impacts on

agriculture and public water supply of the 1974-1976 drought. Brogan and Cunnane (2005)

52 contend that 1976 may have witnessed the lowest recorded river flows since the 1930s. They

also cite droughts in 1934, 1949, 1955, 1959, 1975, 1989, 1990, 1991 and 1995.

54 MacCarthaigh (1996) compared 1995 with droughts back to 1975 whilst Dooge (1985)

55 provides a synopsis of droughts in Irish history beginning with accounts in the Annals of

56 Ulster and of Clonmacnoise (for the period AD 759 to 1408). Symons (1887) documents five

57 droughts in the 1850s, two in the 1860s and three in the 1870s. Garcia-Suarez and Butler

58 (2006) find periods with persistently negative annual Palmer Drought Severity Index at

Armagh in the 1880s, 1890s, 1930s, 1970s and 1990s. Mandal (2011) estimated low flows for

60 125 Irish rivers using catchment properties. Aside from these sources, there is little

61 quantitative information on which to base rigorous assessments of long-term drought risk and

62 water planning for Ireland.

63 This *Short Communication* addresses this knowledge gap by using the homogeneous Island

of Ireland Precipitation (IIP) network of Noone *et al.* (2015) to evaluate the *occurrence* and

65 *persistence* of meteorological droughts since 1850. Here, a straightforward definition of

66 drought is used for half-year periods or longer that have below average precipitation, at both

67 site and regional scales. We accept that the term 'drought' is ambiguous and that runs of

68 seasonal rainfall deficiency do not necessarily translate into periods of agricultural,

<sup>&</sup>lt;sup>1</sup> Freeman's Journal available through Irish Newspaper Archives <u>www.irishnewsarchive.com/</u>

69 hydrological or environmental drought (Wilhite and Glantz, 1985). Nonetheless, our 70 interrogation uses seasonal rainfall and persistence metrics not applied in the homogenization 71 process to quality-assure the integrity of series within the IIP network. We first reprise the 72 methods used to homogenise the IIP series and list other homogeneous rainfall products for 73 comparison. We then describe and apply statistical techniques for simulating occurrence and 74 persistence of below average rainfall across the IIP network. This leads into an account and 75 interpretation of the key findings before concluding with a few suggestions for further 76 research.

77

# 78 **2. Data**

79 Our analysis draws on several data sets. The homogeneous IIP network contains monthly 80 totals for 25 stations (Figure 1) covering the common years 1850 to 2010 (Noone *et al.*, 2015). 81 Precipitation data underpinning the IIP network were drawn from four sources: long-term 82 series held by the Climatic Research Unit (UK) and Centre for Environmental Data Archival 83 (UK) updated to 2010 (16 stations); the record of Armagh Observatory (UK) (1 station); plus 84 digital and paper records of varying completeness held by Met Éireann (IE) (8 stations). Raw 85 data exist for all 25 stations from 1908; 23 from the 1890s; 19 from the 1880s; and 8 in the 86 1850s. The longest continuous record is for Belfast which begins in 1812.

87 In preparation of the IIP network, for each station, detailed information about correction

88 factors, nearest neighbours, observer practices, meteorological site and gauge condition was

89 transcribed to a master file of meta-data to help interpret break points detected during

homogenisation. The HOMegenisation softwarE in R (HOMER) package (Mestre *et al.*, 2013)

91 was used to detect and correct inhomogeneity in the monthly series and to infill/extend

92 records to the period 1850-2010 (see: Noone *et al.*, 2015). HOMER compares differences

93 between candidate and reference sites within a network to identify likely break points that can

94 then be ratified against meta-data. Given the low density of long-term stations available for

- 95 IIP, at least 12 correlated reference stations for each candidate series were identified for
- 96 pairwise comparison and break detection. Annual correction factors were applied to
- 97 confirmed break points using an ANOVA model (Caussinus and Mestre, 2004; Mestre et al.,
- 2013; Venema *et al.* 2012). Missing data were infilled using the same method such that all
- records start in 1850 with correction factors based on the adjustment amplitude applied until

- 100 the first detected change point of the series (Noone et al., 2015). Finally, the regional IIP
- 101 series was constructed as the un-weighted monthly mean of the 25 series.
- 102 Monthly precipitation totals for England and Wales (EWP), Scotland (SP) and Northern
- 103 Ireland (NIP) were obtained from the Met Office Hadley Centre. The EWP series begins in
- 104 1766, whereas SP and NIP start in 1931. All series are based on long-running meteorological
- stations weighted to provide spatially and temporally homogeneous, area-averaged
- 106 precipitation totals (Alexander and Jones, 2001). These precipitation series were used
- 107 alongside the meta-data and archival material described above to quality check the
- 108 provenance of the IIP series and major dry-spells detected therein.
- 109

# 110 **3. Methods**

- 111 Following Wilby et al. (2015) the homogeneous IIP series were processed in four ways. First,
- mean monthly precipitation totals were derived for a baseline period 1961-1990 with
- 113 averages consolidated into mean winter (October to March) and summer (April to September)
- half years. Seasonal anomalies were then calculated for the 1850-2010 series relative to 1961-
- 115 1990 half-year means, recognising that spell lengths are sensitive to choice of baseline period
- 116 (Sen, 1980). As will be shown later, 1961-1990 was a relatively dry period. Therefore, any
- 117 negative anomalies referenced to this baseline are indeed noteworthy.
- 118 The number of stations with below average precipitation was counted for each half year to
- 119 establish the spatial coherence of dry-spells, accepting that this is a crude metric because of
- 120 the sparse and uneven distribution of sites (Figure 1). When more than two thirds of stations
- in the IIP network report a dry season the event is regarded as widespread and unlikely to be
- 122 due to a local anomaly or suspect data. Dates of spells lasting three or more half-year seasons
- 123 were then cross-referenced to EWP and SP to establish coherence at the scale of the British-
- 124 Irish Isles.
- 125 Second, conditional dry-to-dry (Pdd) and wet-to-wet (Pww) first-order Markov model
- 126 transition probabilities were determined from series of seasonal anomalies. This involved
- 127 counting the frequency with which a below average season is followed by another dry season.
- 128 Pdd is the proportion of transitions that are dry-to-dry out of all transitions (i.e. dry-to-dry
- 129 plus dry-to-wet). Similarly, Pww was derived from the proportion of wet-to-wet transitions.

130 Unbroken dry- and wet-season runs were used to construct frequency distributions of spell 131 lengths and to identify the most persistent dry-spells in each record. Pdd and Pww were also 132 estimated for 30-year moving blocks to establish whether there has been any long-term 133 change in dry- and/or wet-spell persistence throughout the IIP, EWP, NIP and SP series. 134 Third, as in Wilby (2007), Sharma and Panu (2012; 2014a;b) and Wilby *et al.* (2015), Pdd 135 and Pww transition probabilities based on 1850-2010 observations were used to 136 stochastically simulate series of seasons with above or below average rainfall. The process 137 begins by seeding with a uniform random number r[0,1] to determine whether there is a 138 change from the initial state (assumed to be below average rainfall). If  $r \leq Pdd$  the dry-spell 139 continues; if r > Pdd then the new state is wet and Pww is applied at the next time step. In 140 this way, a single 10,000 season Markov model simulation was performed to generate a 141 distribution of synthetic spell lengths. The two-sample, nonparametric Kolmogorov-Smirnov 142 (KS) test was applied to determine whether the largest discrepancy (Dstat) between observed 143 and simulated cumulative distributions of spell-length was significantly (p < 0.05) greater than 144 expected by chance. 145 Finally, 1000 boot-strap, Markov model simulations were performed to generate 100- and 146 160-year (i.e. 200 and 320 season) sequences for each site and region. Maximum dry- and

147 wet-spell lengths were retained from all 1000 realisations to construct distributions of

147 wet-spell lengths were retained from all 1000 realisations to construct distributions of

synthetic 100- and 160-year spells for comparison with observations. The 160-year event was

149 generated for equivalence with observed record lengths; the 100-year event enables

150 comparison with Wilby *et al.* (2015). Both sets of distributions were used to estimate

151 likelihoods of a 10-season spell with below average precipitation at each site. This provides

an upper bound (yet plausible) dry-spell that is much longer than the single season (1995)

design drought applied in, for example, the Dublin City Council (2010) Water Plan.

154

# 155 **4. Results**

156 Figure 2 shows seasonal anomalies as percentages of the 1961-1990 mean for IIP and EWP

157 since 1850. The IIP series is significantly correlated with both EWP (r = +0.75) and SP (r =

158 +0.57) (not shown). Seasonal anomalies of IIP vary between -40% (winter 1879/80) and +49%

159 (summer 1924). Most (84%) seasons lie within  $\pm 20\%$  of the 1961-1990 average precipitation.

160 Overall, the driest 30-year period in IIP was 1884-1913 with 2% less precipitation than 1961-

161 1990. Hence, our chosen standard period was close to the very driest continuous run in the

162 IIP series and any negative anomalies would certainly have been indicative of dry seasons.

163 However, as noted at the outset, meteorological droughts do not necessarily coincide with

164 significant agricultural, water resource or environmental stress.

165 Nine dry-spells lasting longer than three seasons (and simultaneously occurring at more than

166 two thirds of stations) were identified (Table 1). Persistent events stand out in 1853-1856,

167 1886-1888 (followed shortly by 1892-1894) and 1970-1973 (tailed by 1974-1976). Dry spells

168 in the 1850s and late nineteenth century have been reported previously for Ireland

169 (Barrington, 1888; Symons, 1887; Tabony, 1980) and for England and Wales (Barker et al.,

170 2004; Burt and Howden, 2011; Burt and Horton, 2007; Jones et al., 2006; Marsh et al., 2007;

171 Wilby and Quinn, 2013). Likewise, dry-spells in the 1970s achieved notoriety for their

172 drought orders, rota cuts and standpipes across parts of south Wales, central and southern

173 England, water rationing in the Channel Islands, and even nightly shut-offs in Belfast (Rodda

and Marsh, 2011). Another noteworthy feature is the relatively quiet period 1908-1950 for

175 widespread, multi-year droughts (Table 1). Our criteria (i.e. two thirds of stations reporting

anomalies lasting at least three seasons) exclude well-known intense, but short-lived droughts

177 of 1921, 1933/34 and 1941-1943 that are evident in both IIP and EWP (Marsh et al., 2007).

178 Overall, the longest unbroken runs of dry half-years in IIP were 14 seasons at Waterford

179 (1912-1919/1920); 12 at Cork Airport (1905-1911); 11 at both Markree Castle (1882-

180 1887/1888) and Mullingar (1904-1909) (Figure 3). All four dry-spells occurred prior to the

181 era of digital records (1941) but overlap with the coherent rainfall deficits (Table 1) of 1886-

182 1888 (at Markree Castle) and 1905-1907 (at Cork Airport and Mullingar). While no breaks in

this period were detected by Noone *et al.* (2015) the exceptionally long run of seasons with

184 below average precipitation at Waterford may be explained in part by documented

185 movements and sheltering of the rain gauge at Gortmore (used to bridge the record by

186 Tabony (1980)). Meta-data further signal that the Markree Castle gauge was 'leaking' and the

187 provenance of a 10 season dry spell at Belfast is questionable due to a large change of

188 correction factor applied by Tabony (1980) for bridging stations in the 1850s.

189 The most persistent dry-spell recorded anywhere in the IIP network since record digitisation

190 (1941) lasted 9 seasons at Cappoquin (1969-1973). This period partially overlaps with the

191 longest dry runs in the central and southeast part of the network covering Athboy, Birr Castle,

192 Drumsna, Enniscorthy, Foulkesmills, Portlaw and Roches Point (Table 2). The single season

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drought in 1995 is noteworthy for the large precipitation anomaly (-35%) averaged across all

194 stations in the IIP network. The most recent 20 years have witnessed only a few single and

two season dry-spells (in 1996-97, 2001-02 and 2003-04) consistent with wetter and stormier

196 conditions (Sutton and Dong, 2012; Matthews *et al.*, 2014; 2015).

197 The relative quiescence of droughts since the 1990s is reflected by the moving average Pdd

and Pww indices (Figure 4). In particular, Pww shows non-stationary behaviour towards

199 more persistent wet-spells that is also evidenced by the EWP and SP series. The 30-year

200 mean Pww for IIP peaked in 2009 whereas Pdd is now lower than at any time since the

201 period 1938-1967, consistent with trends in SP. [Note that IIP and NIP are not independent

series because the former contains some records used to construct the latter. With this in mind,

the divergence in persistence behaviours over the last decade could reflect the influence of

the comparatively high density of stations within IIP along the east and southeast seaboard].

205 The KS test indicates that simulated and observed spell distributions are statistically (p<0.05)

206 indistinguishable across all regional (Figure 5) and station (Figure 6) series. The model tends

207 to overstate the frequency of single-season dry-spells and underestimate the occurrence of

208 two-season events. Overall, the geometric distribution yielded by the Markov model provides

209 good representations of the observed dry-spell length distribution. The closest match for dry-

spells is for Shannon airport (KS = 0.017) and greatest discrepancy for Ardara (KS = 0.111).

211 Note, however, that the KS results are for the whole distribution whereas the fit to tails is

212 more relevant for estimating low frequency events. Validation data are limited for this part of

the distribution so we are restricted to assessing the ability of the model to generate the

214 maximum observed dry-spell length at each site.

215 Table 2 shows the extent to which bootstrap Markov model simulations replicate the most 216 extreme runs of dry-spells in the 160-year series. The model overestimates the duration of the 217 160-year dry-spell by less than one season at 7 sites and by more than one season at 2 sites. 218 The largest discrepancy is for Portlaw where the model simulates a 7.6 season dry-spell 219 compared with 5 season run in observations. Meta data suggest that some precipitation totals 220 are too high at this site due to incorrect conversion between inches and mm. Conversely, the 221 maximum observed dry-spell is underestimated by less than one season at 5 sites and more 222 than one season at 13 sites. The largest difference is at Waterford with 14 observed and 7.5 223 simulated seasons. As noted above, this mismatch may be explained by the likely under-catch 224 and site changes affecting the Waterford record.

225 The 160- and 100-year simulations also provide likelihoods for a 10-season dry-spell for each 226 site and region (Table 2). This outcome is over three times more likely across EWP (p=0.044) 227 than for IIP (p=0.012). To date, the maximum observed dry-spell for Dublin is 8 seasons 228 (1903-1907), however, the Markov model suggests a relatively high likelihood (p=0.125) of a 229 10-season run of rainfall deficiencies in a 160-year record. A slightly higher likelihood is 230 estimated for Markree Castle (p=0.127) but this could be due to fitting the model to a record 231 with possible rainfall under-catch in the early part of the series. On the other hand, a 10-232 season dry-run is least likely at Armagh (p=0.008), Birr Castle (p=0.005), Foulkesmills 233 (p=0.008) and Roches Point (p=0.009). 234 Comparison of probability distributions for simulated maximum dry- and wet-spell lengths 235 reveals three distinct patterns (Figure 7). There are sites with greater dry-spell persistence 236 than wet-spell persistence (Dublin, Enniscorthy, Markree Castle, Mullingar, Phoenix Park); 237 sites where wet- and dry-spell lengths have similar likelihoods (Ardara, Athboy, Belfast, 238 Cork, Derry, Drumsna, Malin Head, Portlaw, Rathdrum, Strokestown, UC Galway, 239 Waterford); and sites where a given wet-spell length is more likely than the same length dry-240 spell (Armagh, Birr, Cappoquinn, Foulkesmills, Killarney, Roches Point, Shannon, Valentia). 241 Across all sites and 100-year simulations, the longest dry-spell was generated for Dublin and 242 persisted 24 seasons (not shown in Figure 7). This might appear implausible but Dublin 243 observations contain near unbroken runs exceeding 20 seasons in 1850-1868 (26/36), 1928-244 1946 (23/36) and 1961-1978 (23/35).

245

#### 246 **5. Discussion**

247 Using 1961-1990 as the reference period (and excluding Waterford and Markree Castle for 248 reasons noted above) we found that the longest observed run of below average precipitation 249 persisted 12 seasons at Cork Airport (1905-1911). Noone et al. (2015) note that this record 250 was originally constructed by Tabony (1980) using a composite of stations with data prior to 251 1962 based on a lower elevation gauge at University College Cork. This station change is 252 thought to explain lower early seasonal totals and a detected break point in 1958. The break 253 was adjusted by Noone et al. (2015) but the same correction factor was applied across all 254 months which could affect dry run persistence for this station.

255 The next longest run lasted 11 seasons at Mullingar (1904-1909) but, again, Noone et al. 256 (2015) report break points in 1937 and 1950 that could be due to a station change in the latter 257 case. Correction of the 1950 break resulted in a large downward adjustment, again potentially 258 affecting dry run persistence. The 10 season dry-spell at Belfast (1853-1858) has already 259 been queried, so the longest run now becomes 9 seasons at Ardara (1927-1932), Cappoquinn 260 (1969-1973), Phoenix Park (1903-1908) and Strokestown (1919-1912) (Table 2). The Ardara 261 record is based on a composite of stations with a small amplitude break point in 1983. While 262 Strokestown has been bridged from 1961, the years 1908-1961 represent a stable period in 263 the record (Noone *et al.*, 2015). No breaks were detected for Cappoquinn and there are no 264 issues of note from metadata. There are documented station moves early in the record at 265 Phoenix Park but these pre-date the identified dry run and a station inspection in 1903 noted a 266 very clear/open site. Therefore, having accounted for break points, station/instrument changes 267 and reported measurement errors the most credible, conservative upper bound continuous 268 dry-spell length for the IIP network is 9 seasons.

269 Our sub-annual analysis interrogated data that were homogenized at annual scales and thus 270 represents a stringent test of the IIP network. Anecdotal accounts, proxy sources and data 271 from neighbouring regions, all provide a basis for quality assuring our catalogue of 272 widespread multi-year rainfall deficits (Table 1). We find issues with two stations (Waterford 273 and Markree Castle) that were not picked up in the annual homogenisation of Noone et al. 274 (2015). While the confounding issues identified by metadata may have negligible effect at 275 annual resolution they can evidently become important when examining long duration 276 rainfall deficits. Additionally, suspicion is raised at Cork, Mullingar and Belfast that high 277 persistence of negative rainfall anomalies may be an artefact of using a single correction 278 factor equally across several months. Both issues arise despite application of best-practice 279 methods for homogenisation and emphasise the need for cautious use of homogenous series, 280 particularly when examining sequences of sub-annual extremes. [Note that snowfall is only a 281 small component of total precipitation across Ireland and thus any underestimation normally 282 associated with snowy climates is a minor concern]. Our analysis shows how metadata are 283 critical for increasing confidence in the authenticity of long-term precipitation indices. 284 There is strong independent evidence of persistent, regional droughts in the 1850s and 1880s

but bridging and homogenization techniques increase dependency between records as the

- 286 network density decreases further back in time. This is particularly the case for the 1850s
- 287 where only eight stations were active; by the 1880s this increases to 19. Thus, greater drought

coherence would be expected at the beginning of the IIP series than at the end due to the

- smaller number of active stations. Hence, when evaluating the realism of Markov model
- simulations there is ambiguity about whether inability to replicate dry-spells (>10 seasons) at
- some sites is due to model deficiency, uncertainty in homogenized data, or both.

292 There is plenty of scope for developing more elaborate Markov model simulations for Ireland.

- 293 For example, seasonal Pdd and Pww parameters could be conditioned by the phase of the
- 294 North Atlantic Oscillation, Atlantic Multidecadal Oscillation, or El Niño Southern Oscillation

295 to replicate low-frequency variations (evident in Figure 4) and hence more realistic clustering

of dry-spells at decadal time-scales (e.g. Wilby et al., 2002). The distribution of seasonal

297 precipitation anomalies could be simulated using gamma or normal functions. There is also

scope for multi-site simulation of meteorological drought occurrence and severity across the

- 299 network as a whole and/or within homogeneous precipitation regions. Such tools could be
- 300 used to simulate groundwater recharge, river flow and reservoir levels for vulnerable water
- 301 supply zones, as well as for assessing potential environmental stress.
- 302 An important finding of our analysis is that recent decades have been relatively benign in
- 303 terms of widespread, multi-year sequences of below average rainfall in Ireland. This reflects
- a return to generally stormier and wetter summers since the 1990s (Matthews et al., 2015).
- 305 Nonetheless, there is no room for complacency about drought risk given rising water
- 306 demands. Routinely updating the Pdd and Pww indices offers a simple way of tracking the
- 307 long-term propensity for seasonal rainfall deficits in Ireland.
- 308

# 309 **6.** Conclusions

310 We have investigated the spatial and temporal properties of long-lasting negative rainfall

- anomalies across the Island of Ireland at site and regional scales with half-year granularity.
- 312 Our aim was to create the first coherent picture of multi-season rainfall deficit occurrence and
- 313 persistence across the region and, in the process, subject the IIP network to stringent appraisal.
- 314 Our preliminary analysis has highlighted the immense value of carefully cataloguing station
- 315 meta-data an essential resource for interpreting break-points and exceptional runs of
- below/above average precipitation. We acknowledge that interpretations of spatial patterns
- 317 are hindered by the sparse and uneven distribution of sites, as well as by the range of issues

318 picked up by meta-data, so we were restricted to describing three types of spell-length regime.

319 Further work is needed to determine whether these regimes form coherent clusters in space.

320 Overall, we find that the Island of Ireland is surprisingly prone to runs of seasonal rainfall 321 deficiency and that major dry spells in the 1850s, 1880s and 1970s were far more persistent 322 than any episodes experienced in the last 40 years. These events could provide useful 323 analogues for stress testing the robustness of water supply and drought plans; a practice that 324 is finding favour elsewhere (e.g. Spraggs *et al.*, 2015). As Irish Water embarks on a period of 325 major investment in water infrastructure, stress testing designs against episodes with negative 326 rainfall anomalies lasting up to 9 seasons offers an altogether different risk assessment than 327 ability to cope with single season deficiencies. We also show that there is relatively high 328 likelihood (p=0.125) of a continuous 5 year (10 season) dry-spell at Dublin, a region in which 329 population growth and aging infrastructure has resulted in a water system operating at the 330 edge of its capacity.

331 In practice, water resource system vulnerability depends on a host of factors including the 332 type(s) of resource (i.e. groundwater, river intake, reservoir, or combination of sources); 333 amount of raw and treated water storage; connectivity of the system linking points of supply 334 to demand; water quality and treatment constraints. Such issues would clearly modulate any 335 assessment of droughts based on the analysis of meteorological data alone. Homogenised 336 rainfall series would need to be fed into more elaborate rainfall-runoff models and then, in 337 turn, simulated inflows input to water system models. Markov modelling, as demonstrated for 338 IIP, offers a way of generating severe drought sequences for evaluating water supply system 339 performance under combinations of long duration and intense rainfall deficits.

340 We have only begun to speculate about the underlying physical drivers of dry-spells lasting 5 341 or even 10 years. This is an area of active research, not least because of the potential to apply 342 such insights to long range drought forecasting (Folland *et al.*, 2015; Kingston *et al.*, 2015). 343 Assembling homogeneous meteorological records from paper and digital records (with 344 accompanying meta-data) is a laborious but critical part of this process. Creation of the IIP 345 series (Noone *et al.*, 2015), reference networks for river flow (Murphy *et al.*, 2013) and 346 attendant analytical tools (Wilby et al., 2015) is bringing together ingredients needed for a 347 deeper understanding of multi-decadal hydroclimatic variability and change at a sentinel 348 location of Europe.

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# 457 Tables

458

- 459 **Table 1** Periods with more than 2/3 of all IIP stations reporting below average seasonal
- 460 rainfall for at least three continuous seasons compared with dry-spell lengths in IIP, EWP and
- 461 SP. Note that NIP was not included because of the risk of double-counting with IIP.

Period	Tumb	Number of seas	
Perioa	IIP	IIP EWP	SP
1853-1856	6		-
1858-1860	3		-
1886-1888	3		-
1892-1894	3		-
1905-1907	3		-
1951-1953	3		2
1962-1964	3		3
1970-1973	5		5
1974-1976	4	6 4 3	3
			3

- 463 **Table 2** Observed maximum dry-spell duration (seasons) compared with simulated mean
- 464 160- and 100-year events at each site as well as for IIP, NIP, EWP and SP. Likelihoods of a
- 465 simulated 10-season dry-spell are also given.

	Observed	Simulated 160-year event		Simulated 100-year event		
Record	Maximum ev					
		Length	Length	Likelihood	Length	Likelihood
	Period(s)	(seasons)	(seasons)	(10 season)	(seasons)	(10 season)
Ardara	1927-32	9	6.7	0.028	6.1	0.017
Armagh	1892-95	7	5.5	0.008	5.1	0.002
Athboy	1969-73	8	7.0	0.044	6.4	0.027
Belfast	1853-58	10	7.4	0.058	6.6	0.029
Birr Castle	1970-73	5	5.2	0.005	4.7	0.001
Cappoquin	1969-73	9	6.4	0.021	5.8	0.015
Cork Airport	1905-11	12	7.8	0.086	7.1	0.045
Derry	1885-88	6	6.3	0.022	5.7	0.014
Drumsna	1966-70	7	6.6	0.024	6.0	0.018
Dublin Airport	1903-07	8	8.7	0.125	7.8	0.069
Enniscorthy	1969-73	8	7.8	0.068	7.0	0.057
Foulkesmills	1969-73	8	5.6	0.008	5.2	0.001
Killarney	1853-56, 1939-42	6	5.8	0.010	5.2	0.005
Malin Head	1950-54	7	6.9	0.033	6.3	0.022
Markree Castle	1882-88	11	8.6	0.127	7.9	0.089
Mullingar	1904-09	11	8.0	0.111	7.3	0.065
Phoenix Park	1903-08	9	7.9	0.070	7.2	0.053
Portlaw	1855-58, 1888-91,	-5	7.6	0.067	7.0	0.046
	1904-07, 1948-50,					
	1969-71, 2003-06					
Rathdrum	1853-56	6	6.3	0.017	5.8	0.015
Roches Point	1941-43, 1961-63,	4	5.7	0.009	5.2	0.008
	1969-71, 1974-76,					
	1990-92					
Shannon Airport	1904-07	6	6.8	0.032	6.2	0.018
Strokestown	1919-22	9	6.2	0.027	5.8	0.008
UC Galway	1887-91	7	7.2	0.048	6.6	0.033
Valentia	1908-11, 1970-73	6	6.6	0.023	6.0	0.021
Waterford	1912-20	14	7.5	0.061	6.9	0.048
IIP	1969-73	8	6.0	0.012	5.6	0.009
NIP	1970-73	7	6.0	0.014	5.5	0.009
EWP	1900-03, 1904-07,	8	7.0	0.044	6.5	0.034
	1941-44	-				
SP	1970-73	6	5.6	0.008	5.0	0.004
		-				

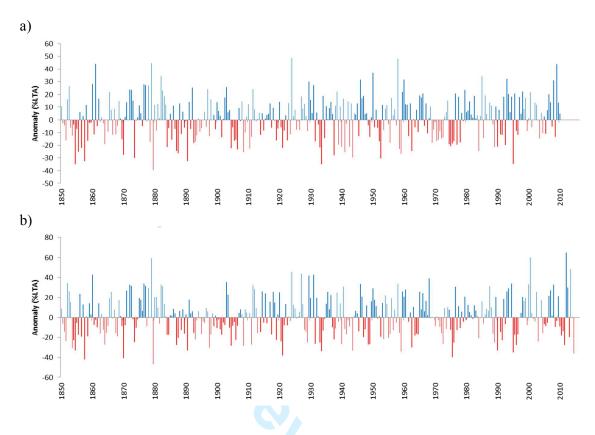
468 Figures



469

470 **Figure 1** Map of station locations

471



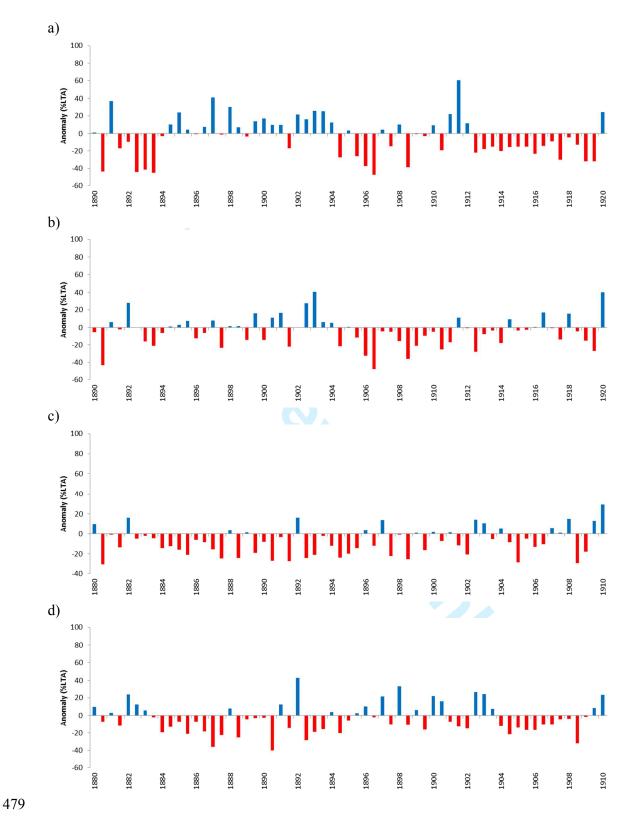
474 **Figure 2** Above (blue) and below (red) long-term average precipitation totals in winter

475 (October to March) and summer (April to September) half years (seasons) across a) the Island

476 of Ireland and b) England and Wales for the years 1850-2010. All deviations are percentage

477 anomalies with respect to the 1961-1990 mean.

478



480 Figure 3 Long-run dry-spells at a) Waterford (1912-1919/1920), b) Cork Airport (1905481 1911), c) Markree Castle (1882-1887/1888) and d) Mullingar (1904-1909)

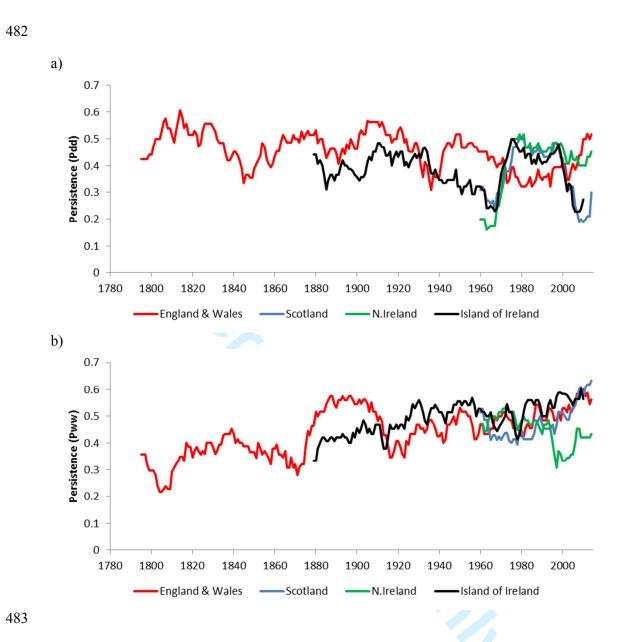
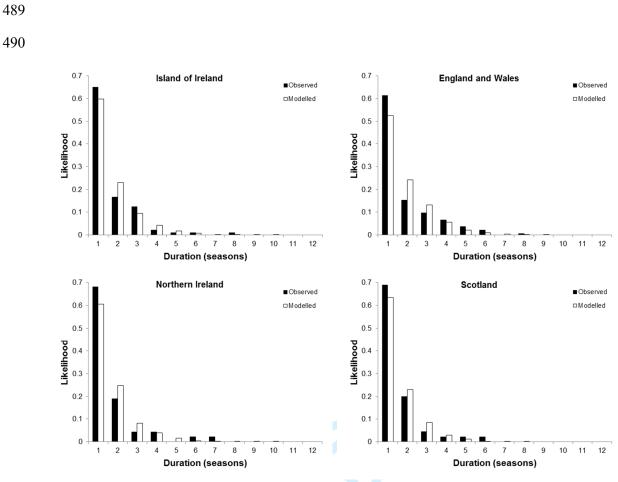


Figure 4 a) Dry-to-dry (Pdd) and b) wet-to-wet (Pww) season persistence for the Island of
Ireland, Northern Ireland, England and Wales, and Scotland. All series are based on 30-year
moving windows with anomalies referenced to the 1961-1990 mean. Adapted from Wilby et
al. (2015).



- 492 **Figure 5** Observed and modelled likelihood of dry-spells of duration 1 to 12 seasons in the
- 493 Island of Ireland (1850-2010), Northern Ireland (1931-2014), England and Wales (1766-2014)
- 494 and Scotland (1931-2014). Adapted from Wilby et al. (2015).

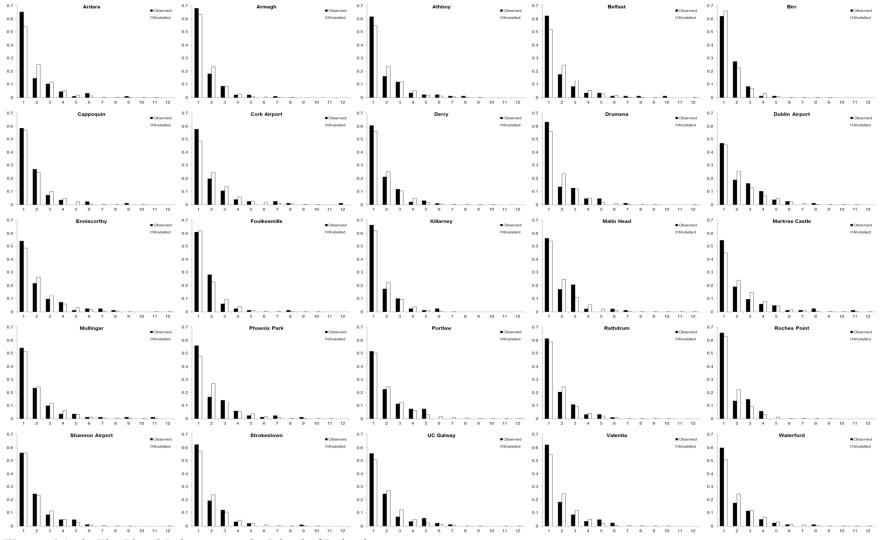


Figure 6 As in Fig.5 but 25 sites across the Island of Ireland.

