

A Stochastic Space-Time Rainfall Model for Engineering Risk Assessment

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Appendices

Appendix A

Spatial Storm Extent

A.1 LIST OF RAINFALL GAUGES

The following two tables respectively show the pluviograph gauges and daily rainfall gauges used in the case study. The same order of gauges is preserved when comparing the simulated statistics to observed statistics.

Table A.1 List of pluviograph gauges from Sydney Water Observation Network

| Gauge ID | Latitude | Longitude | Description |
|----------|----------|-----------|--------------------------------|
| 563059 | -33.69 | 150.301 | KATOOMBA (CASCADE CK DAM No.1) |
| 563070 | -33.7 | 150.485 | LINDEN (WOODFORD CK DAM) |
| 566017 | -33.803 | 151.18 | CHATSWOOD |
| 566018 | -34.033 | 151.163 | CRONULLA STP |
| 566020 | -33.891 | 151.094 | ENFIELD (COMPOSITE SITE) |
| 566025 | -33.783 | 151.257 | MANLY DAM |
| 566026 | -33.921 | 151.157 | MARRICKVILLE SPS |
| 566028 | -33.937 | 151.198 | MASCOT BOWLING CLUB |
| 566032 | -33.89 | 151.224 | PADDINGTON (COMPOSITE SITE) |
| 566033 | -33.939 | 151.026 | PADSTOW |
| 566036 | -33.895 | 151.034 | POTTS HILL RESERVOIR |
| 566038 | -33.862 | 151.278 | VAUCLUSE BOWLING CLUB |
| 566040 | -33.771 | 151.064 | WEST EPPING BOWLING CLUB |
| 566047 | -33.975 | 151.076 | MORTDALE BOWLING CLUB |
| 566051 | -33.691 | 151.3 | WARRIEWOOD STP |
| 567076 | -33.714 | 150.983 | CASTLE HILL STP |
| 567077 | -33.883 | 150.951 | FAIRFIELD STP |
| 567078 | -33.986 | 150.907 | GLENFIELD STP |
| 567087 | -33.734 | 150.767 | ST MARYS STP |
| 567100 | -33.653 | 150.847 | RIVERSTONE STP |

| | | | |
|--------|---------|---------|-------------------------|
| 567102 | -33.699 | 151.025 | DURAL (WPS14) |
| 568045 | -33.891 | 150.592 | WARRAGAMBA MET. STATION |
| 568130 | -34.06 | 150.679 | WEST CAMDEN STP |
| 563059 | -33.69 | 150.301 | KATOOMBA |

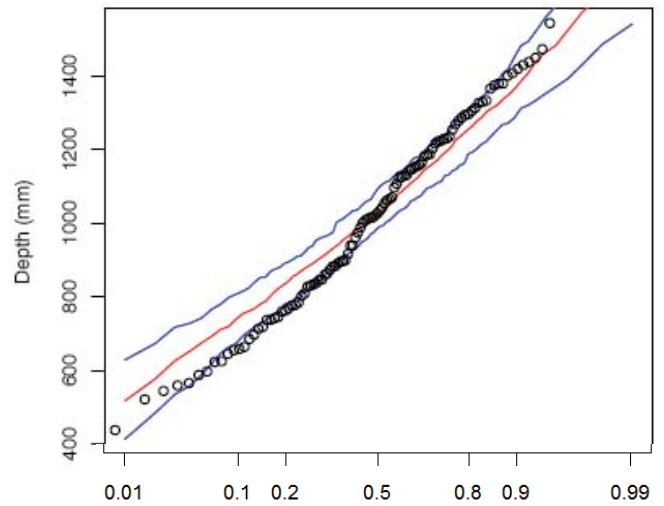
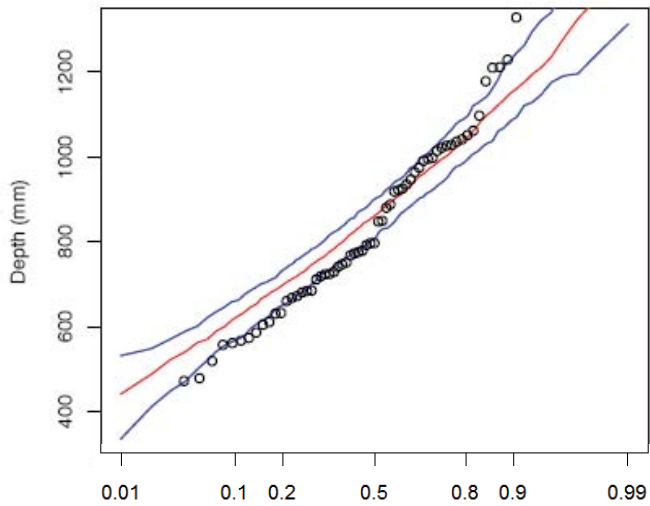
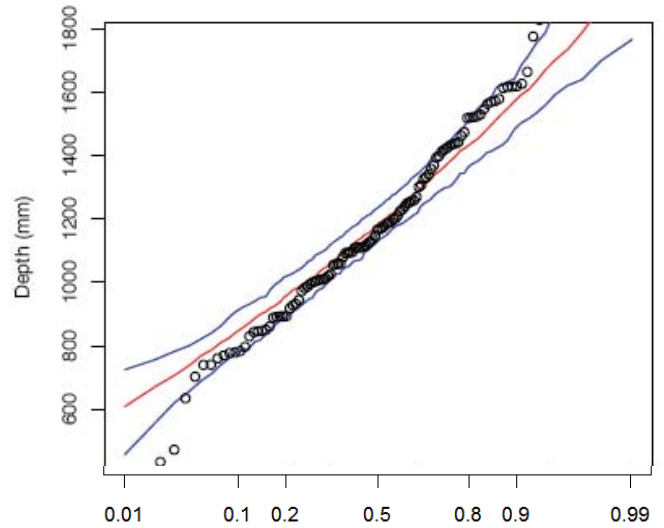
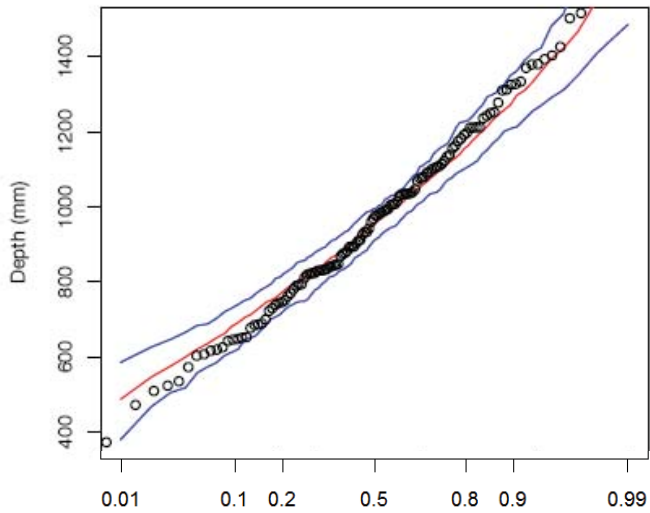
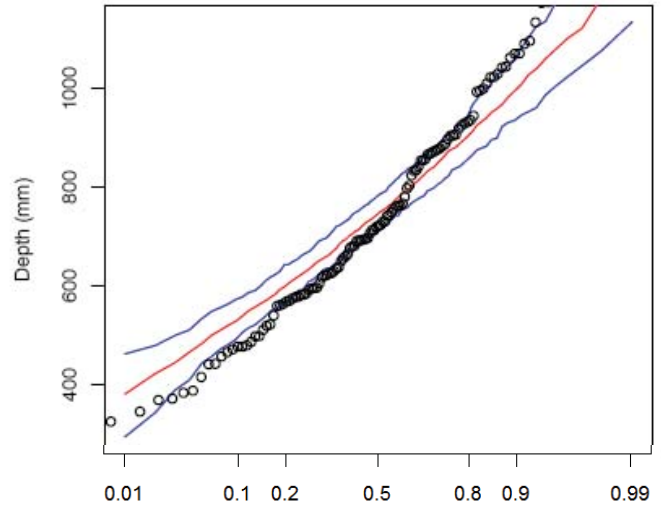
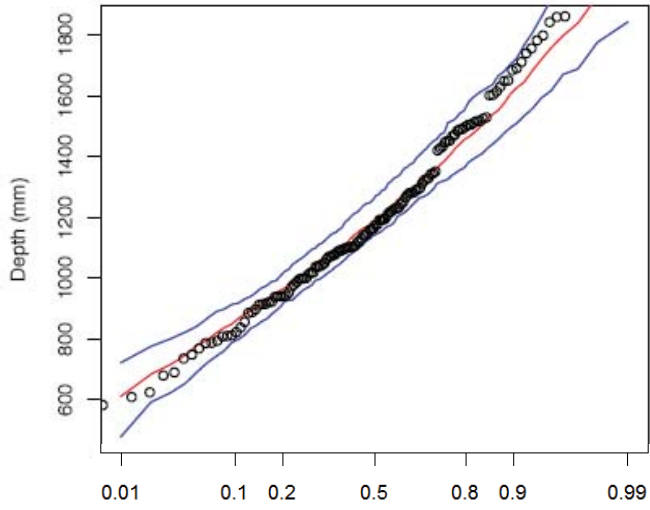
Table A.2 List of Bureau of Meteorology daily rainfall gauges

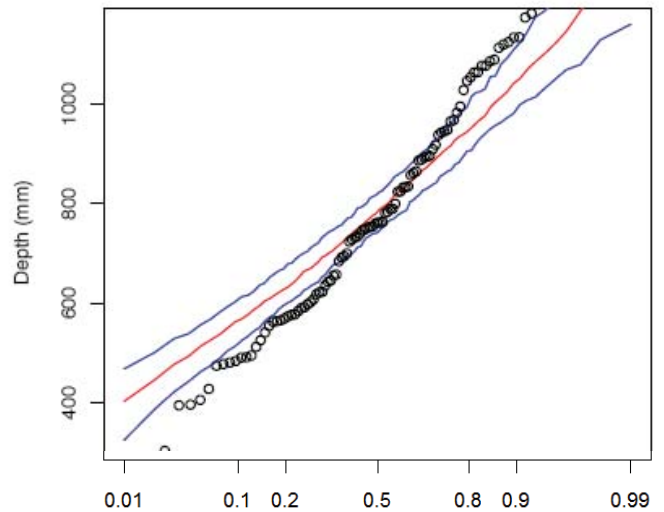
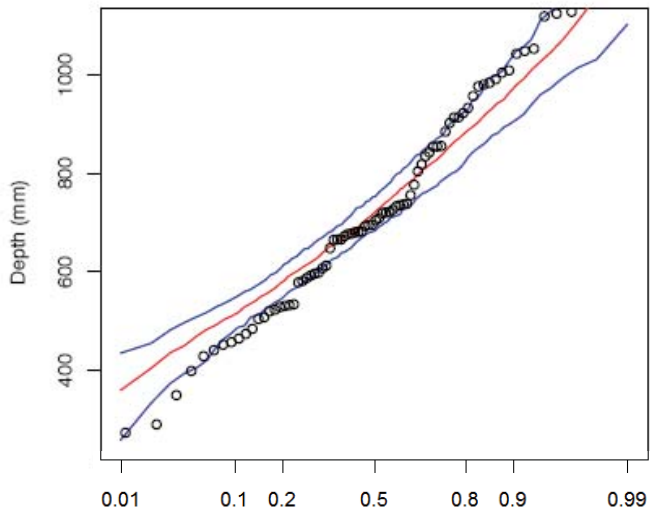
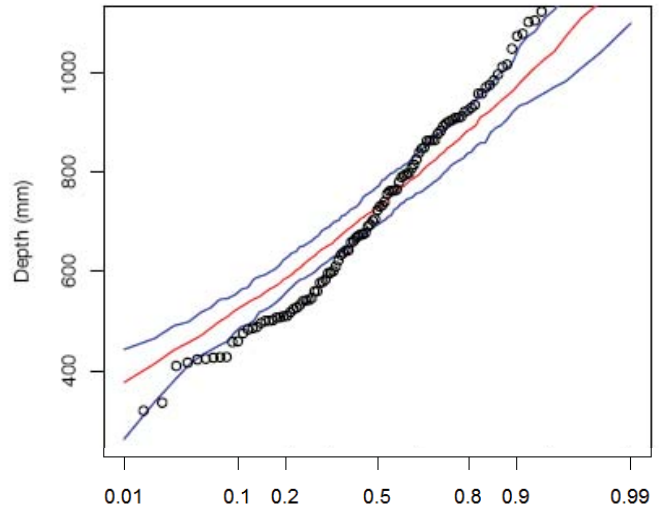
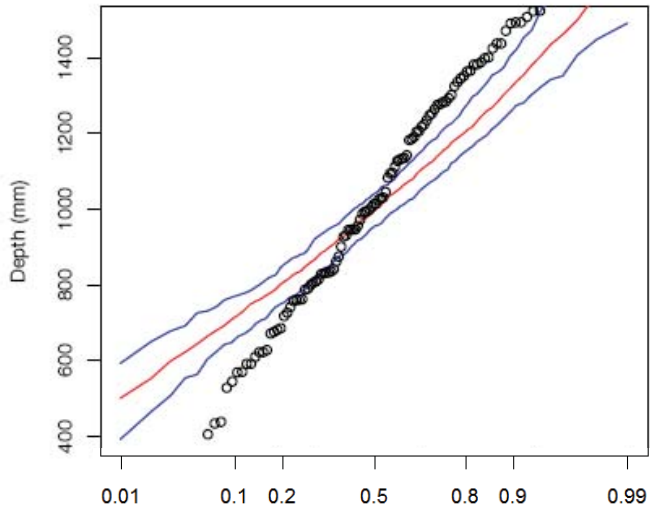
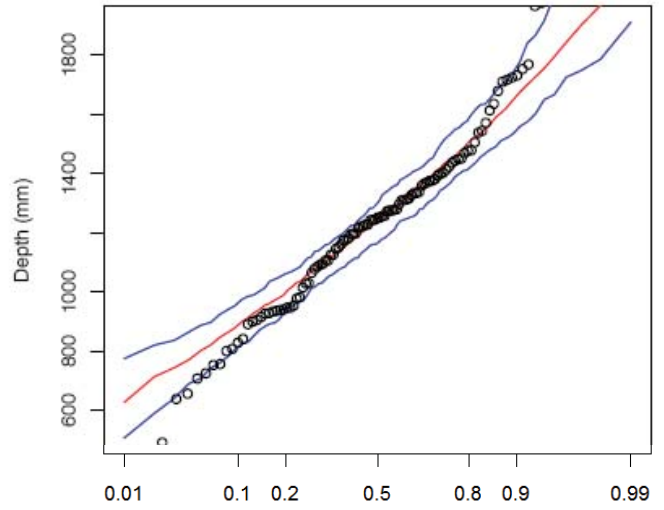
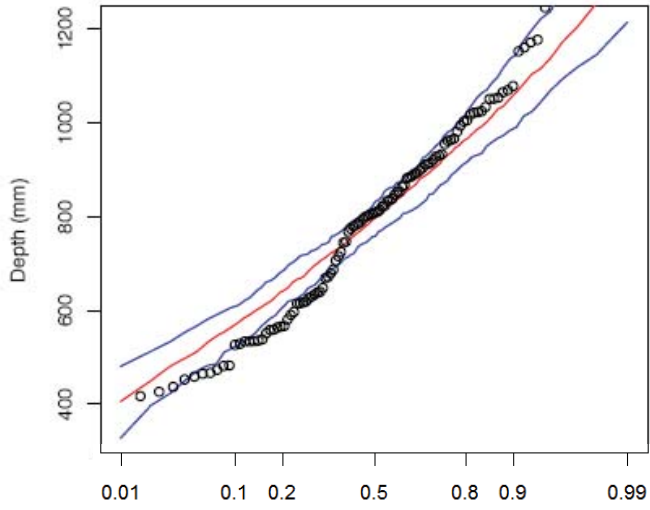
| Gauge ID | Latitude | Longitude | Description |
|----------|----------|-----------|--|
| 66062 | -33.86 | 151.2 | SYDNEY (OBSERVATORY HILL) |
| 067015 | -33.97 | 150.72 | BRINGELLY (MARYLAND) |
| 068045 | -34.55 | 150.38 | MOSS VALE HOSKINS STREET |
| 063043 | -33.54 | 150.63 | KURRAJONG HEIGHTS (BELLS LINE OF ROAD) |
| 066046 | -33.82 | 151 | PARRAMATTA |
| 063056 | -33.59 | 150.25 | MOUNT VICTORIA (MT VICTORIA (SELSDON STR |
| 067021 | -33.62 | 150.75 | RICHMOND - UWS HAWKESBURY |
| 061023 | -33.43 | 151.34 | GOSFORD (GERTRUDE PLACE) |
| 063077 | -33.7 | 150.56 | SPRINGWOOD POST OFFICE |
| 068007 | -34.03 | 150.64 | CAMDEN (BROWNLOW HILL) |
| 068014 | -34.07 | 150.8 | CAMPBELLTOWN 1 |
| 068052 | -34.17 | 150.61 | PICTON BOWLING CLUB |
| 063039 | -33.72 | 150.3 | KATOOMBA COMPOSITE |
| 066006 | -33.87 | 151.22 | SYDNEY BOTANIC GARDENS |
| 068013 | -34.13 | 150.74 | MENANGLE JMAI |
| 066020 | -33.77 | 151.08 | EPPING CHESTER STREET |
| 068044 | -34.45 | 150.46 | MITTAGONG BEATRICE STREET |
| 067019 | -33.82 | 150.91 | PROSPECT DAM |
| 066052 | -33.91 | 151.24 | RANDWICK BOWLING CLUB |
| 068028 | -34.2 | 150.97 | HELENSBURGH (PARKES STREET) |
| 066007 | -33.93 | 151.22 | BOTANY NO.1 DAM |
| 068009 | -34.59 | 150.52 | BURRAWANG (RANGE STREET) |
| 068000 | -34.57 | 150.78 | ALBION PARK POST OFFICE |
| 066000 | -33.89 | 151.13 | ASHFIELD BOWLING CLUB |
| 067018 | -33.75 | 150.68 | PENRITH LADBURY AVENUE |
| 068024 | -34.23 | 150.91 | DARKES FOREST (KINTYRE) |
| 063044 | -33.72 | 150.43 | LAWSON (WILSON STREET) |
| 063118 | -33.52 | 150.49 | BILPIN (FERN GROVE) |
| 066042 | -33.82 | 151.24 | MOSMAN BAPAUME ROAD |
| 066050 | -33.89 | 151.03 | POTTS HILL |

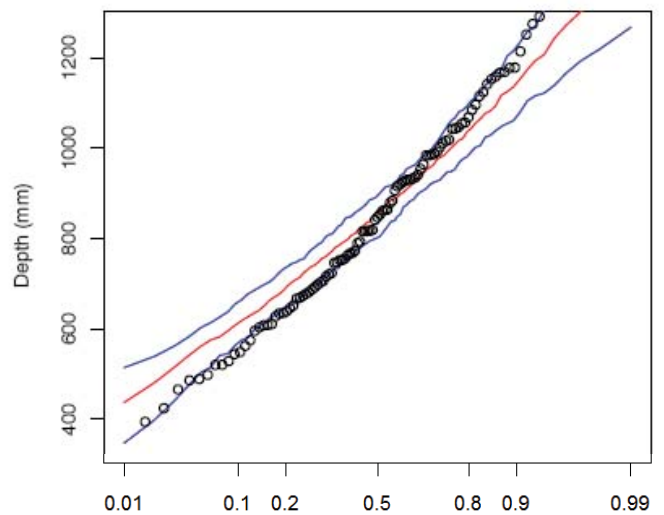
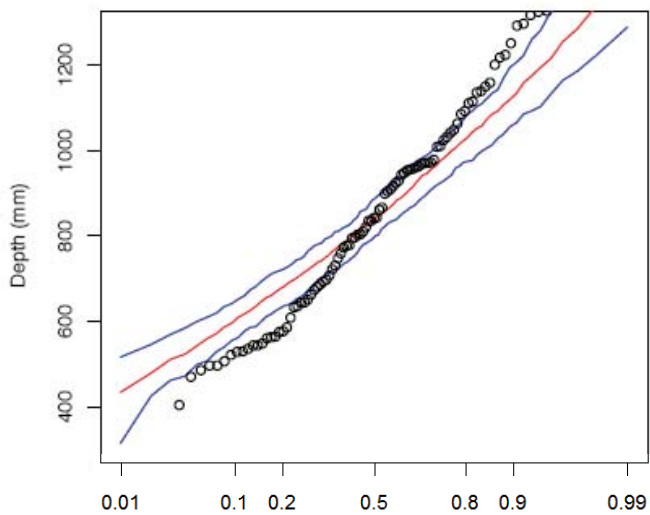
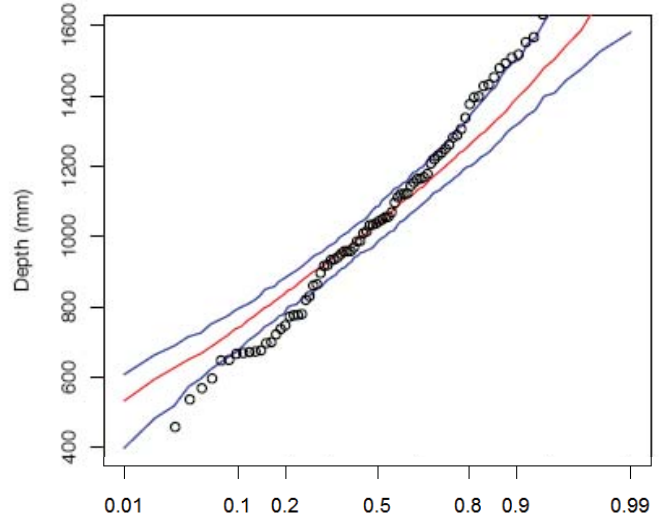
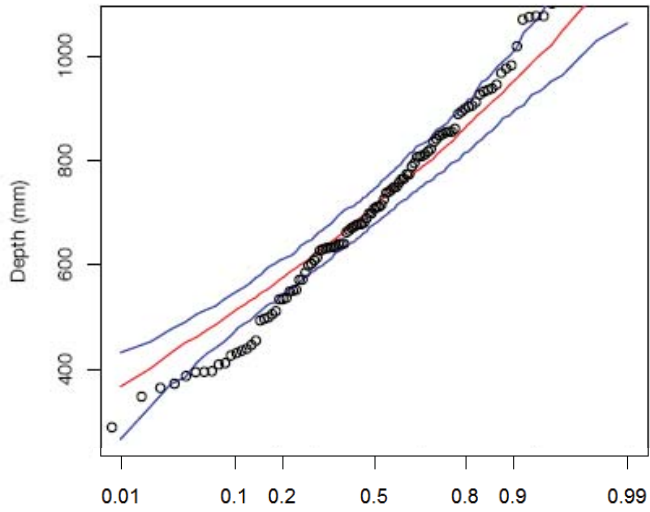
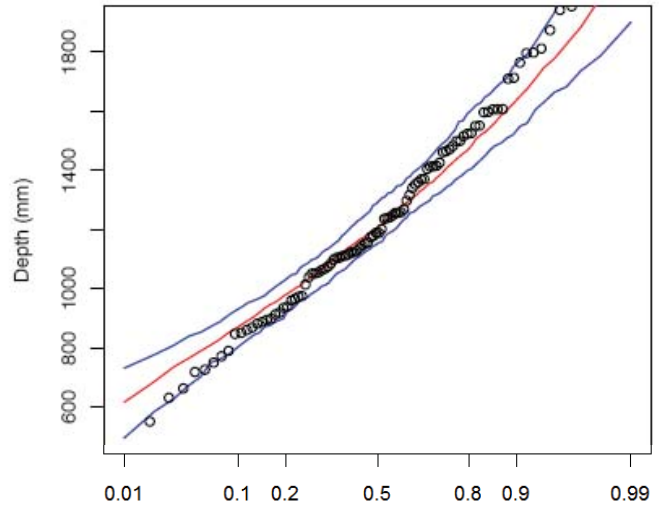
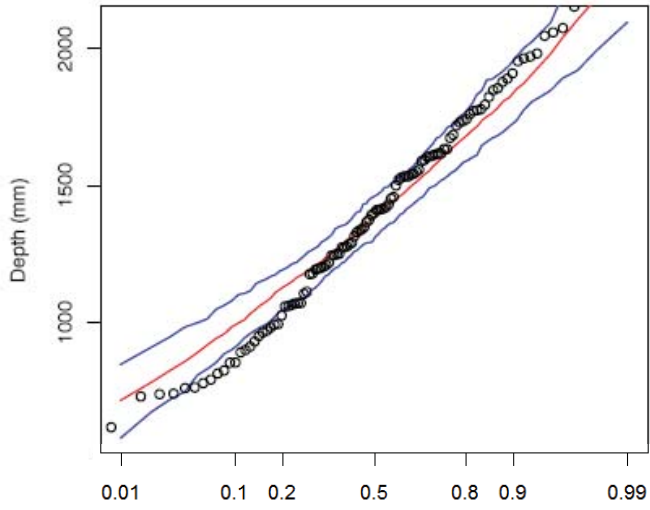
| | | | |
|--------|--------|--------|-----------------------------|
| 063057 | -33.5 | 150.37 | MOUNT WILSON (NOOROO) |
| 067031 | -33.61 | 150.82 | WINDSOR FITZGERALD STREET |
| 063009 | -33.62 | 150.3 | BLACKHEATH (GODSON AVE) |
| 066044 | -33.73 | 151.27 | CROMER GOLF CLUB |
| 066058 | -34 | 151.13 | SANS SOUCI (THE BOULEVARDE) |
| 068043 | -34.03 | 150.84 | MINTO SURREY STREET |
| 068054 | -34.58 | 150.62 | ROBERTSON POST OFFICE |
| 067009 | -33.97 | 150.9 | GLENFIELD (MACQUARIE) |
| 068033 | -34.46 | 150.49 | MITTAGONG (KIA ORA) |
| 061119 | -33.39 | 150.98 | WISEMANS FERRY (OLD PO) |
| 066010 | -33.8 | 151.19 | CHATSWOOD COUNCIL DEPOT |
| 067052 | -33.63 | 151.15 | BEROWRA GOODWYN ROAD |
| 066160 | -33.9 | 151.23 | CENTENNIAL PARK |
| 068016 | -34.27 | 150.81 | CATARACT DAM |
| 066131 | -33.83 | 151.15 | RIVERVIEW OBSERVATORY |
| 068011 | -34.05 | 150.72 | CAMDEN BOWLING CLUB |
| 066040 | -34.04 | 151.1 | MIRANDA BLACKWOOD ST |
| 066120 | -33.76 | 151.15 | GORDON BOWLING CLUB |
| 067004 | -33.75 | 150.67 | EMU PLAINS |
| 066153 | -33.78 | 151.25 | MANLY VALE (MANLY DAM) |
| 068022 | -34.5 | 150.78 | DAPTO BOWLING CLUB |
| 068001 | -34.21 | 150.79 | APPIN CHURCH ST |

A.2 SIMULATED ANNUAL TOTALS

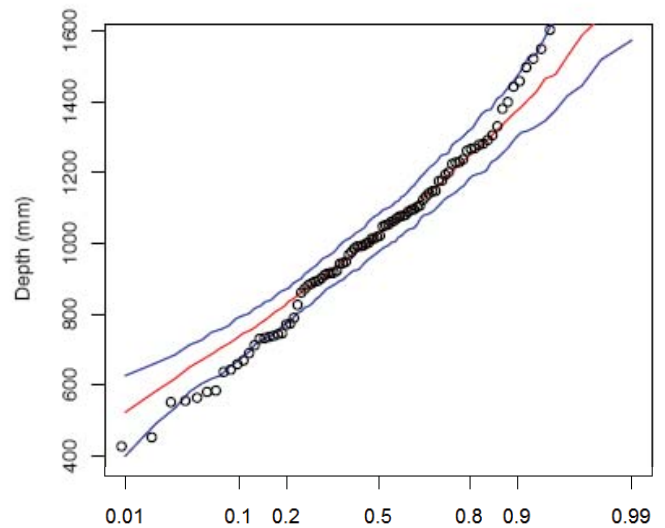
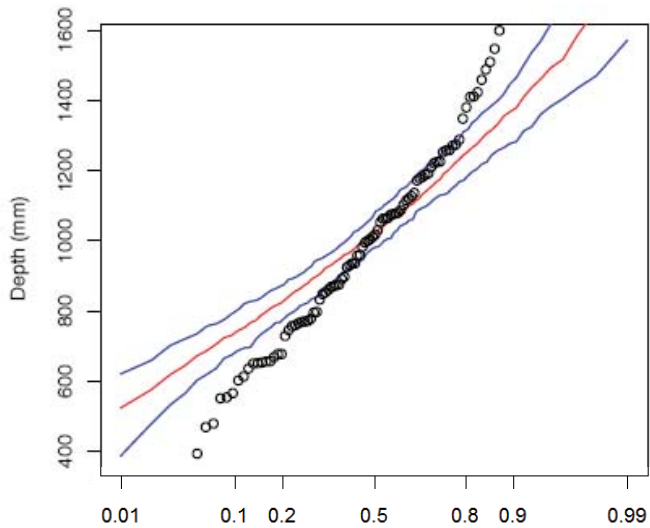
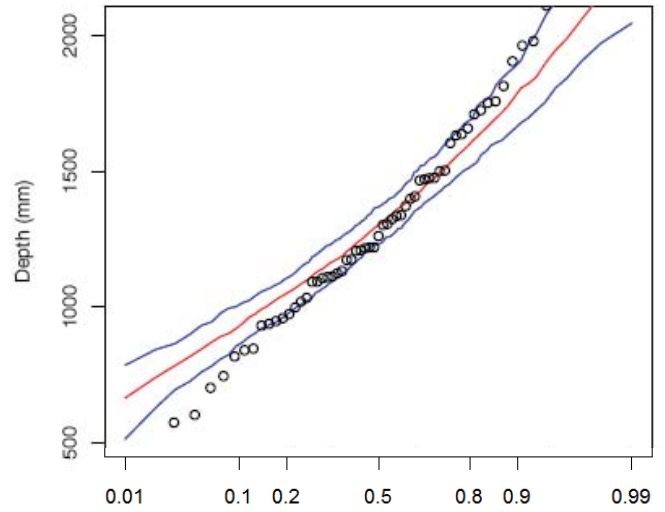
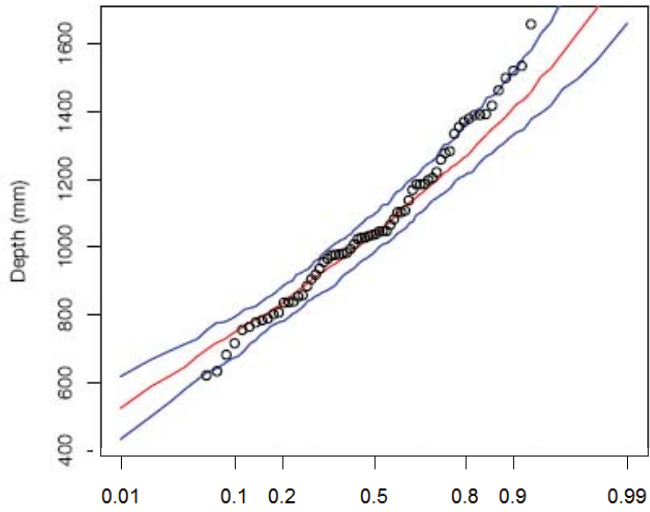
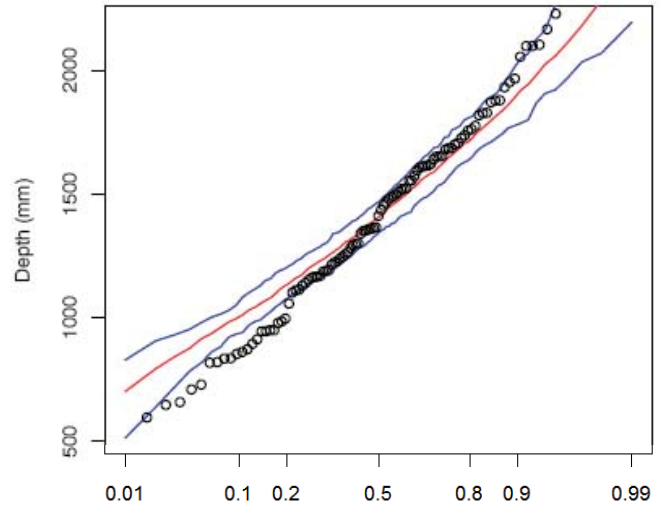
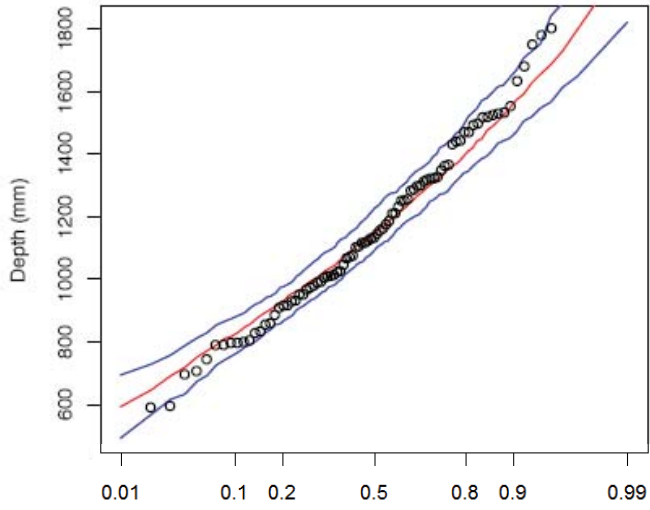
The following plots show the simulated distribution of annual totals compared to the observed distribution at each of the 52 daily rainfall sites. The plots correspond to the same order of sites as listed in Table A.2 when read from left to right, top to bottom. The distributions are plotted against a normal probability-axis. The lines correspond to 0.05, 0.5, 0.95 simulated order statistics at each quantile. The mean of this distribution is matched exactly for each site owing to the scaling methodology. Reasons for undersimulating the variance of this distribution are discussed in Chapter 7

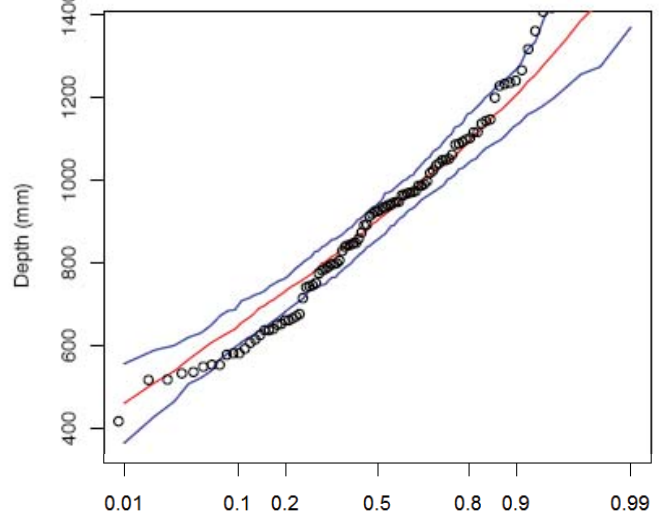
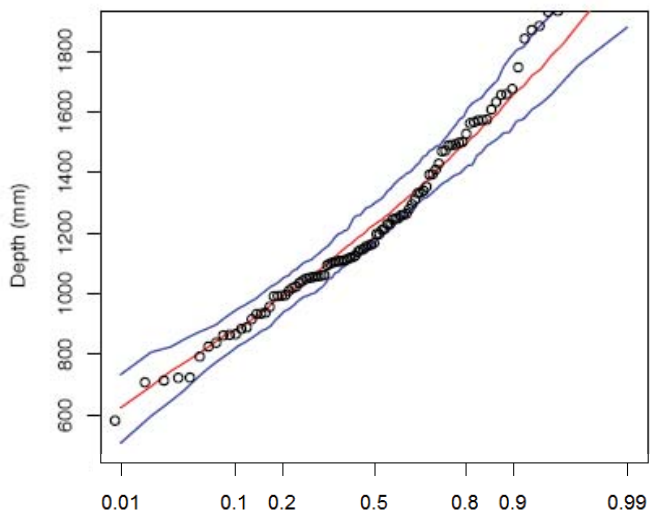
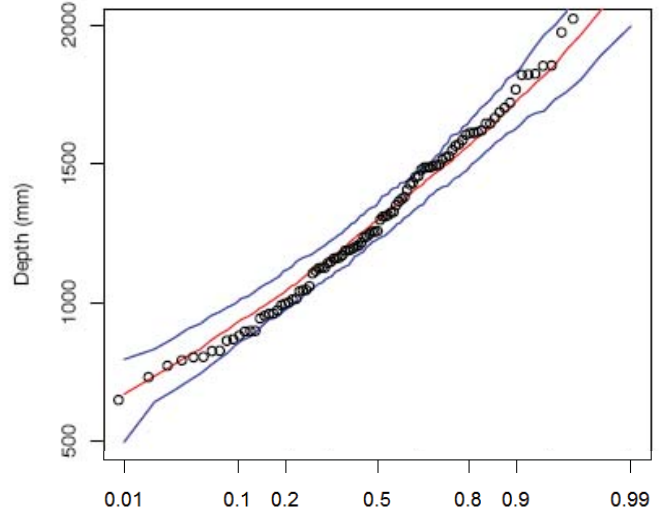
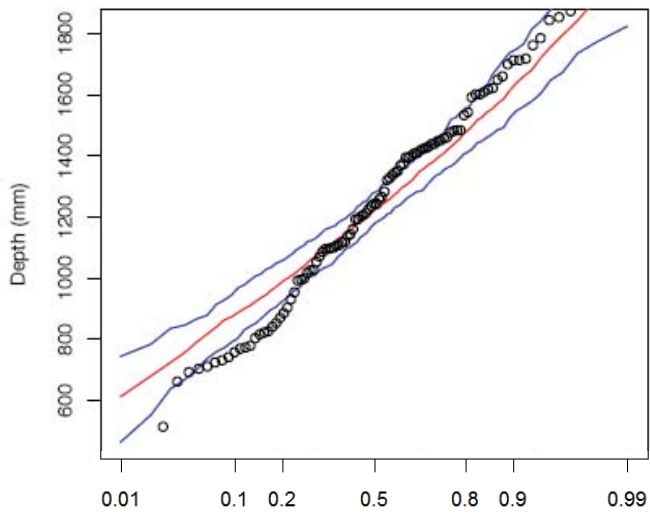
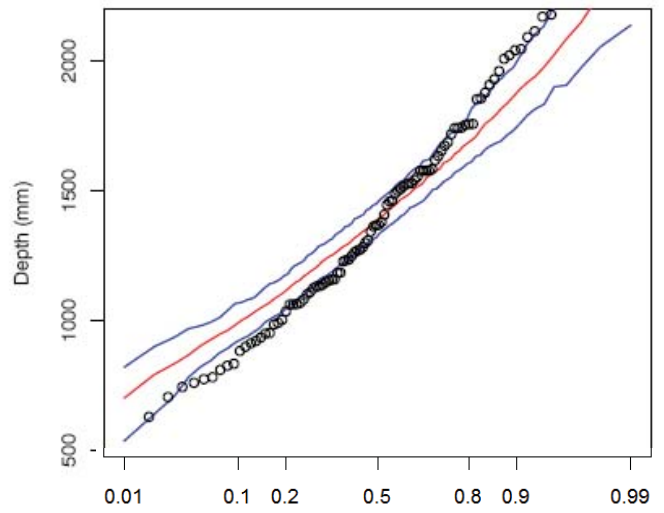
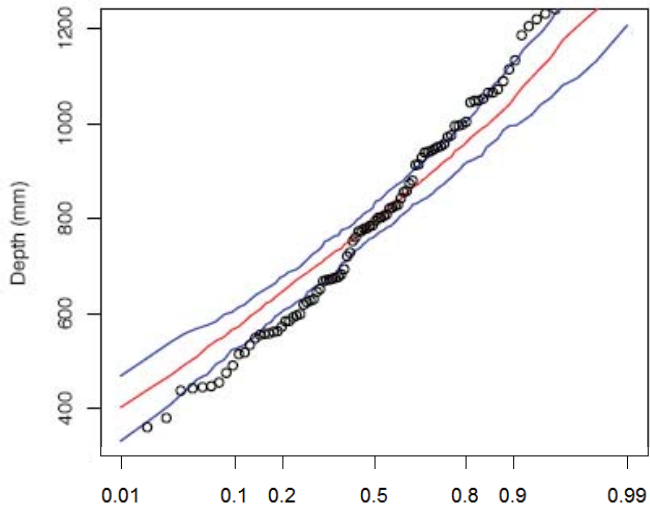




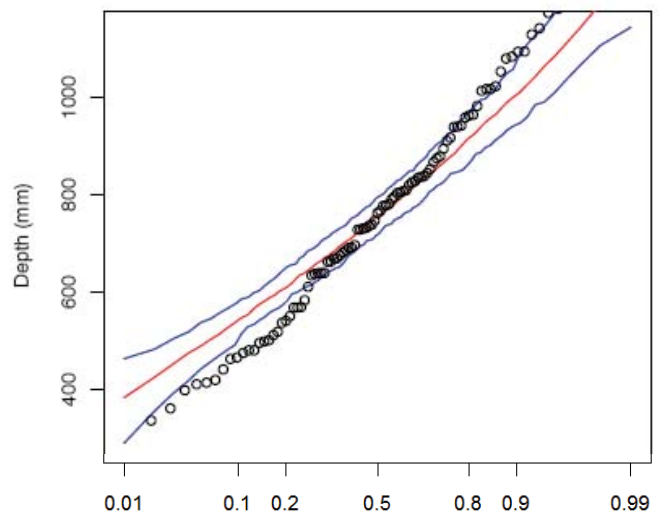
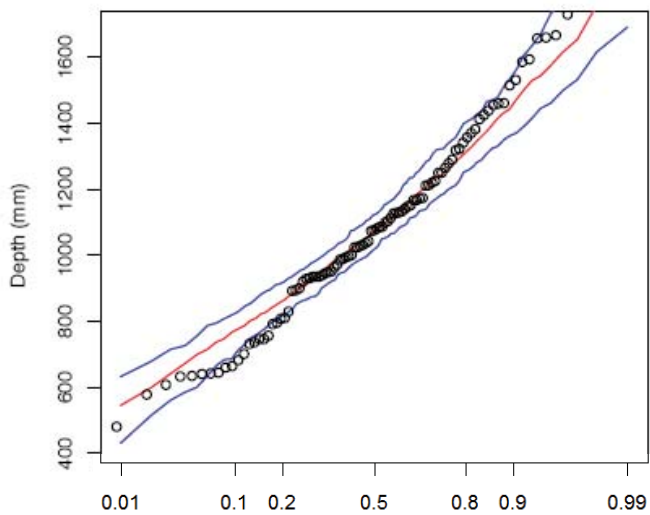
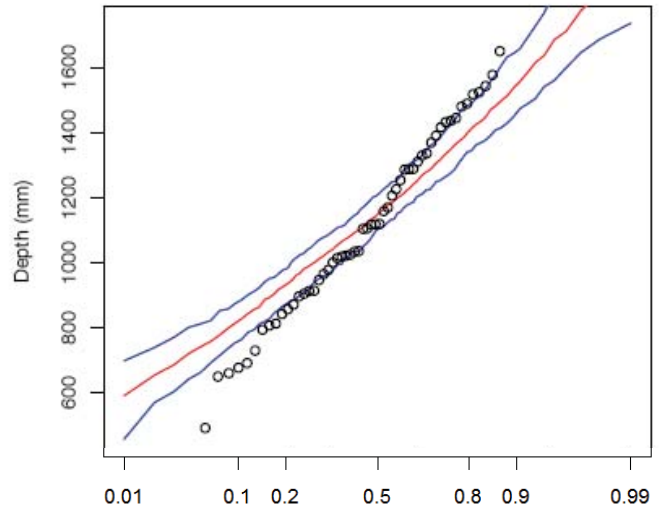
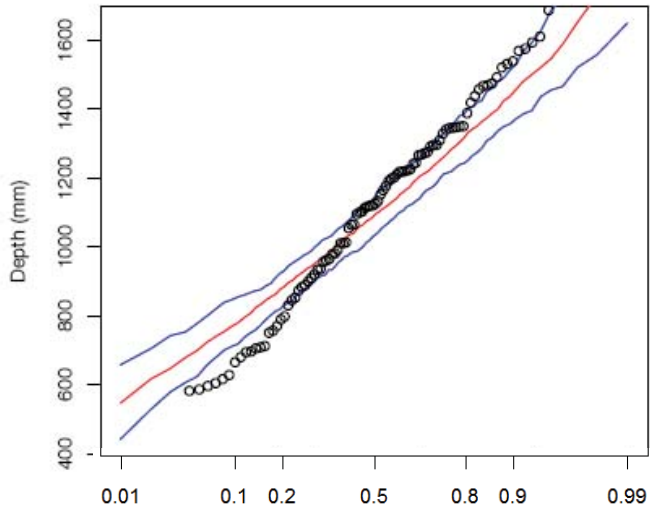
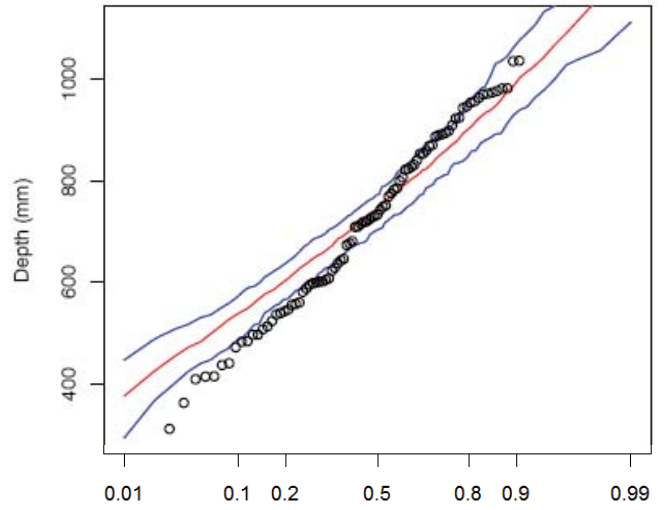
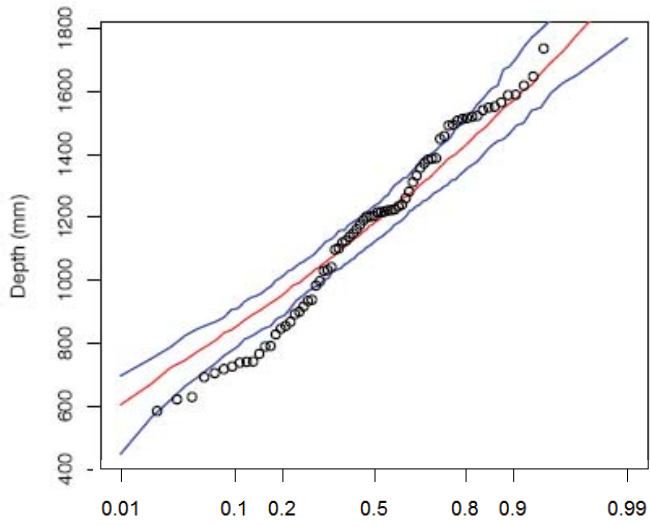


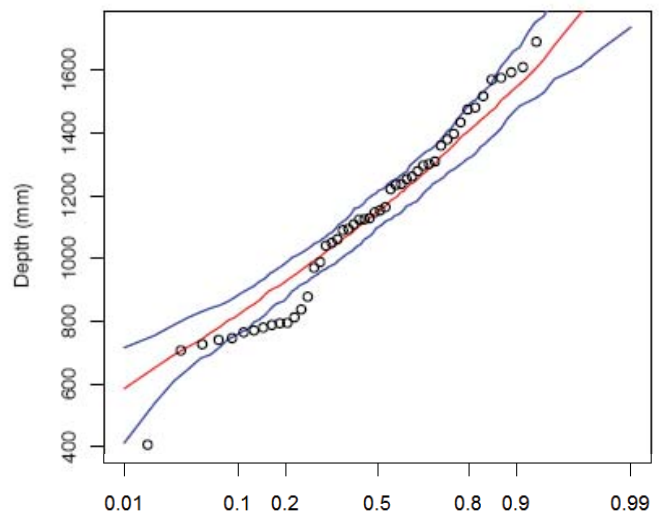
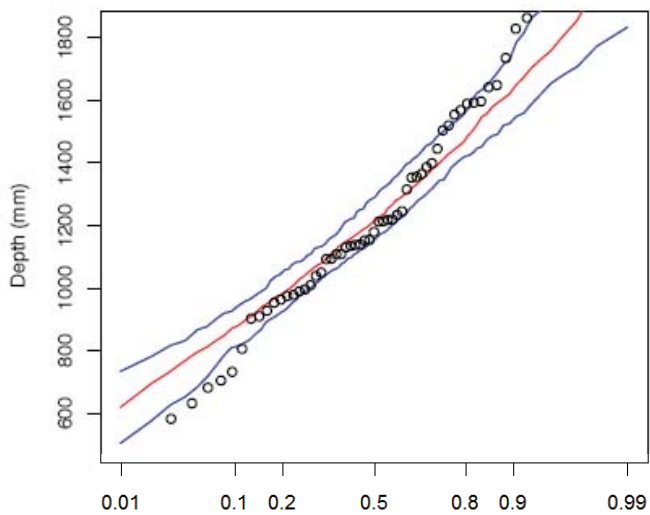
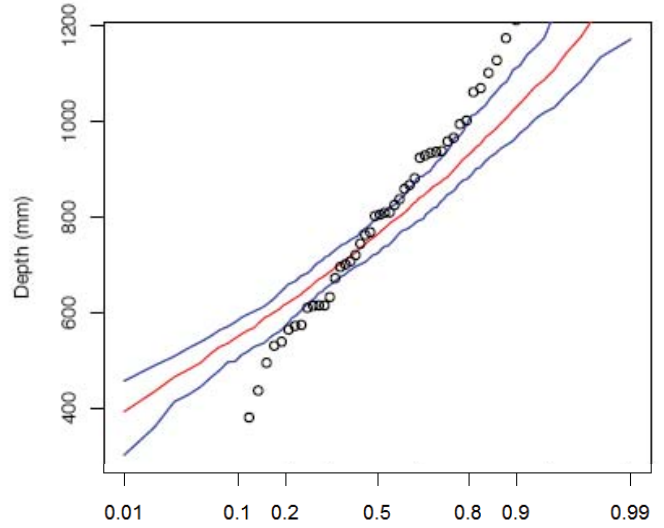
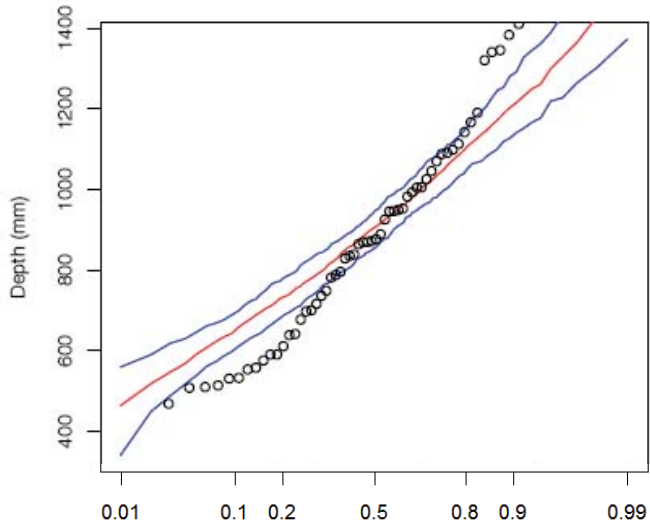
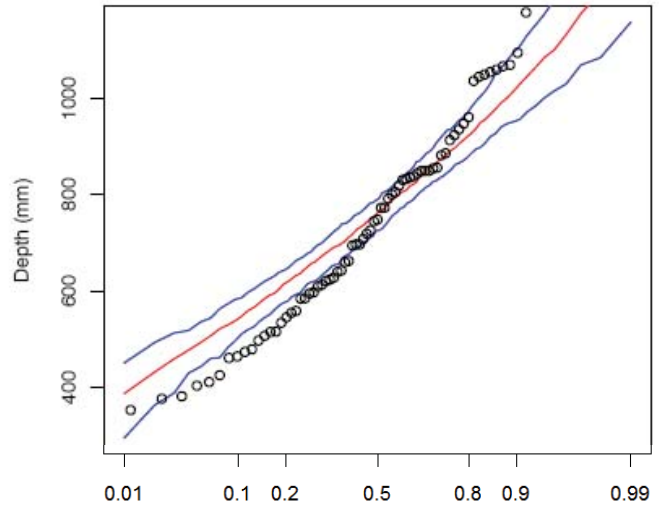
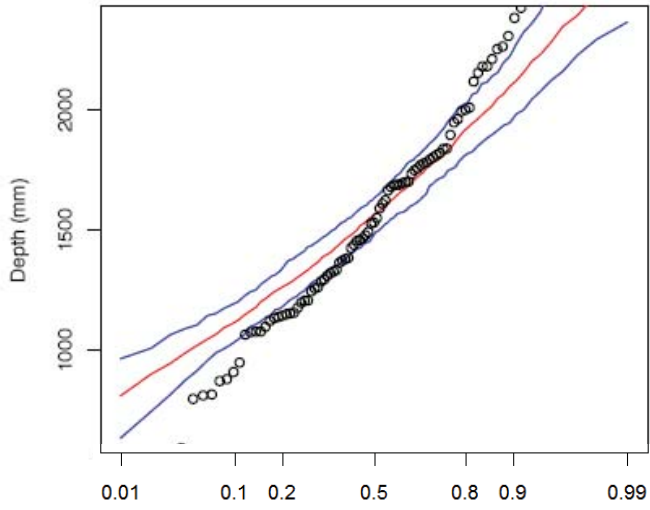
Appendix A – Spatial Storm Extent



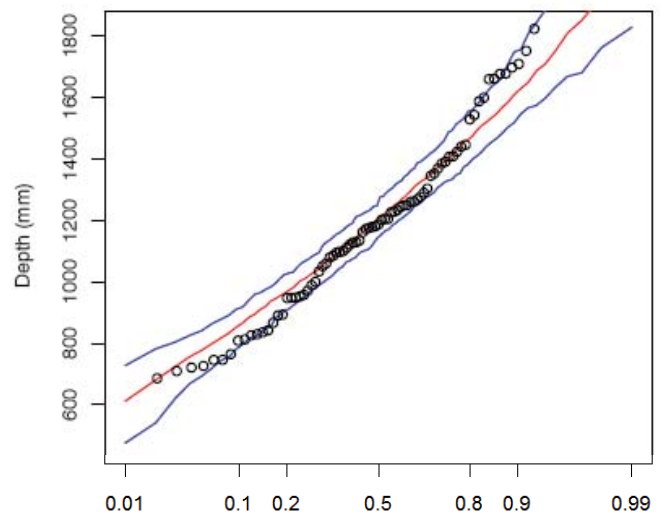
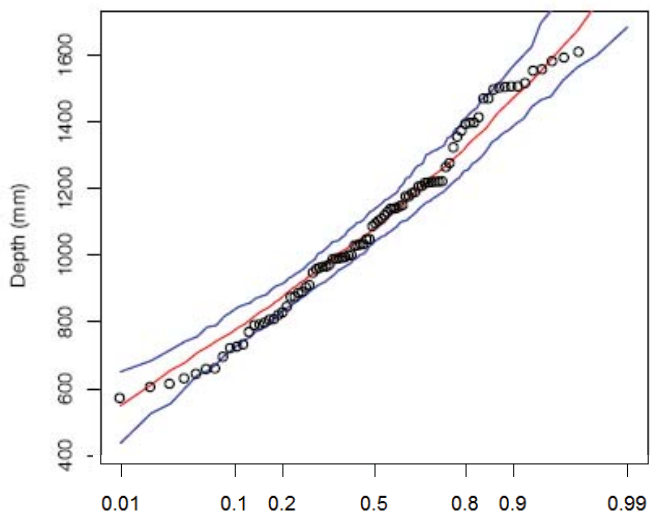
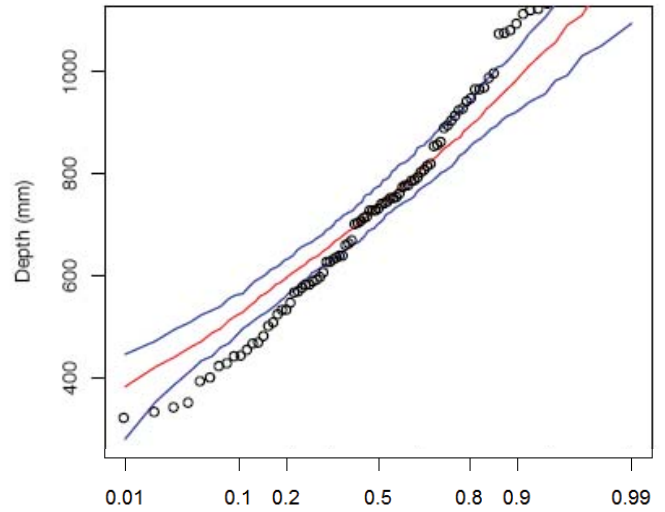
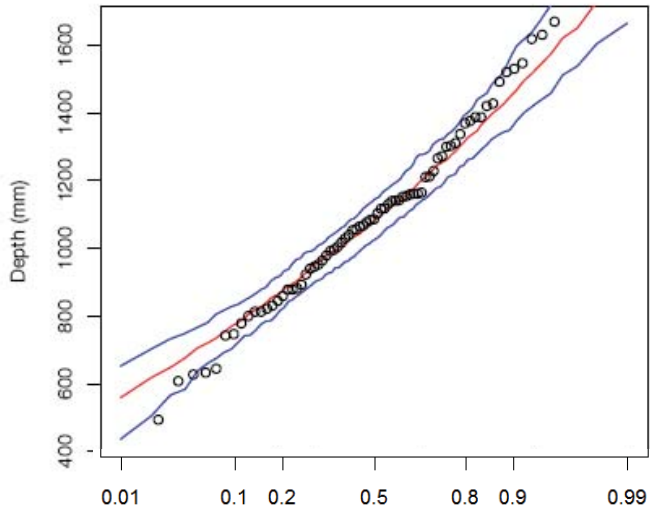
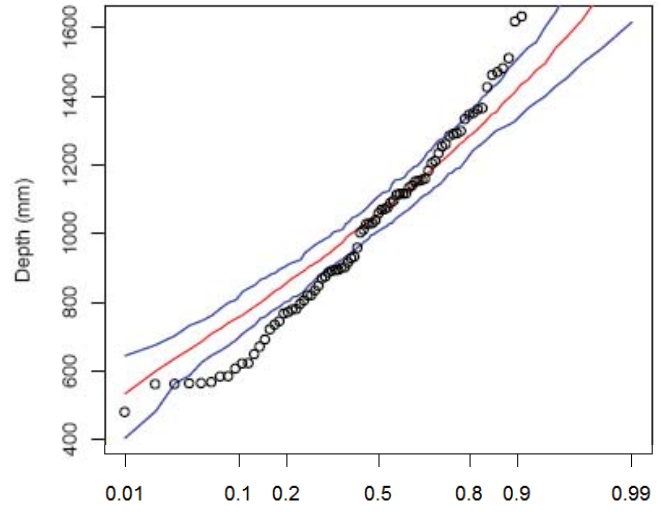
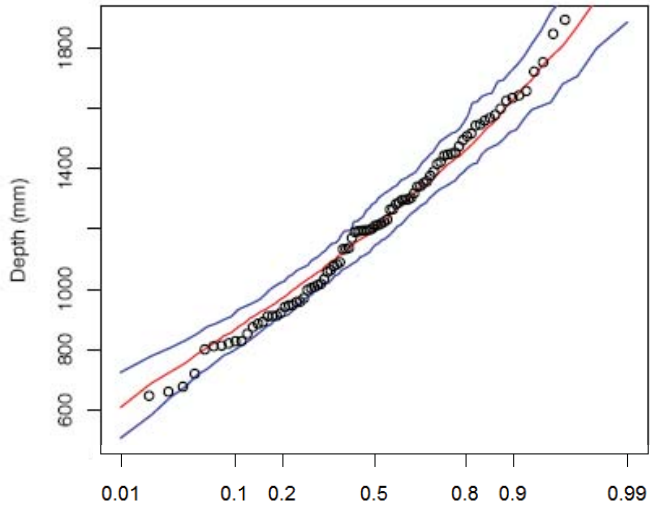


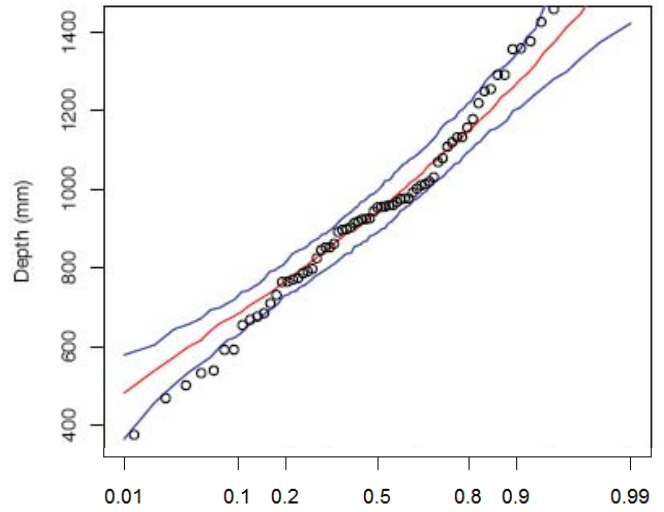
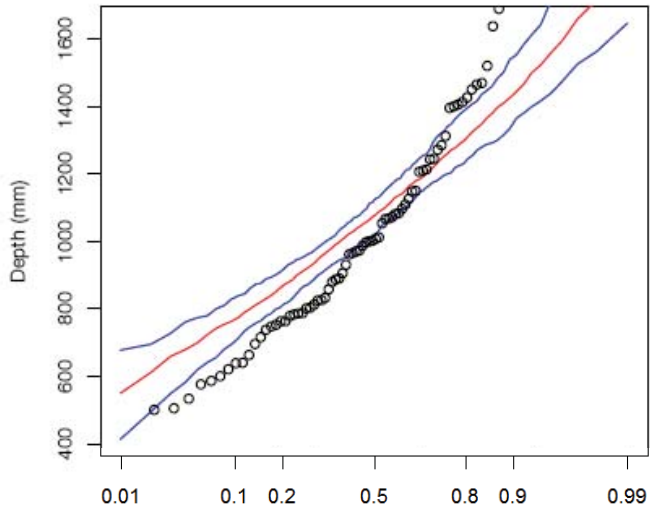
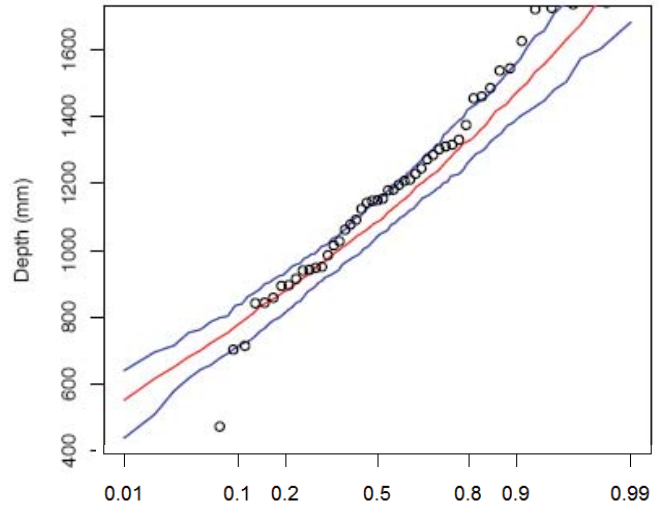
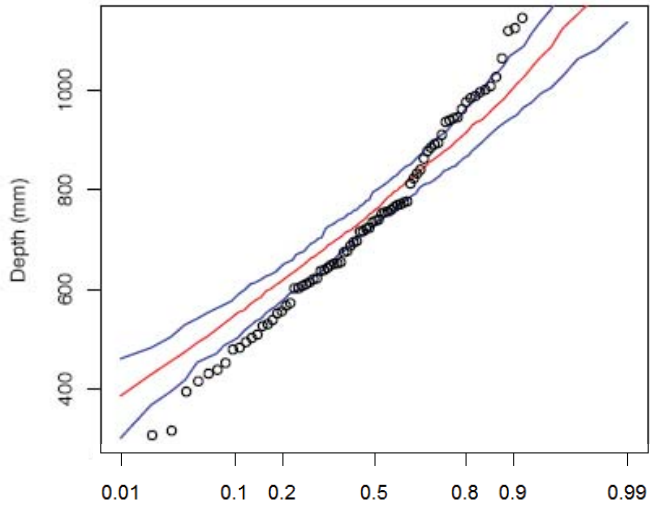
Appendix A – Spatial Storm Extent





Appendix A – Spatial Storm Extent

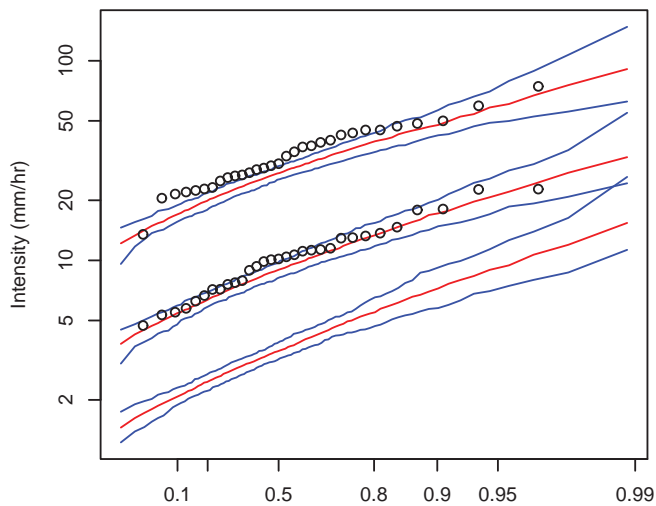
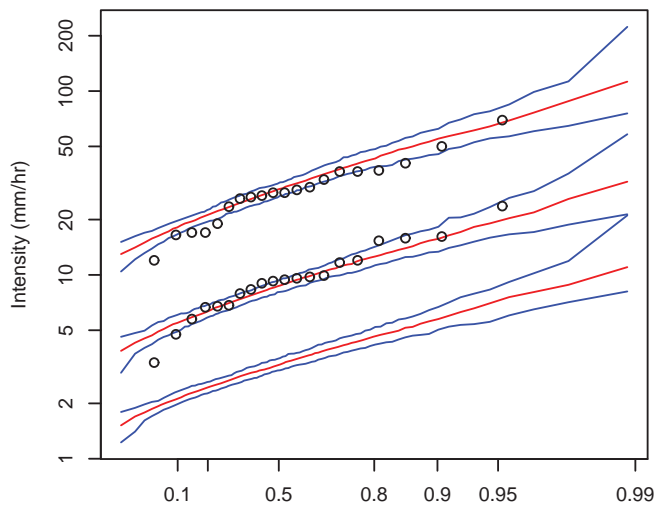
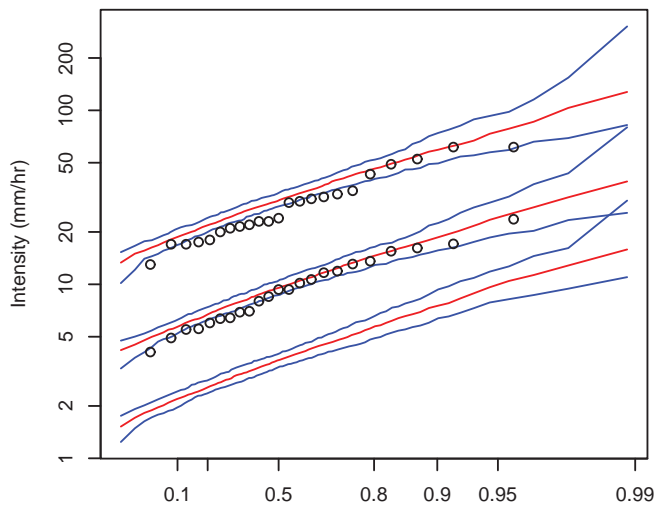
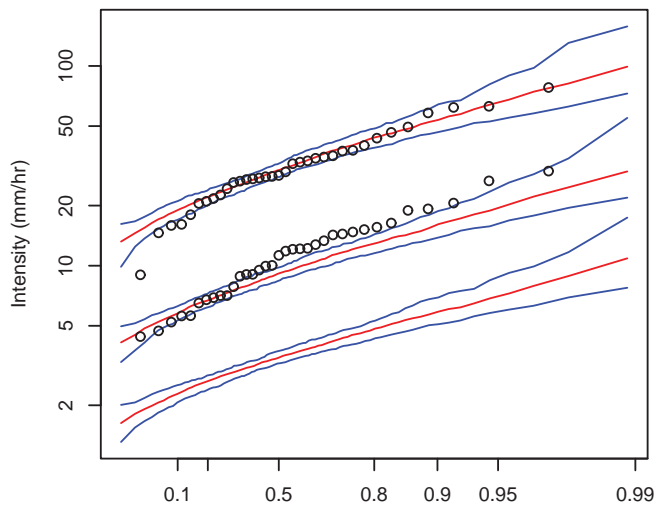
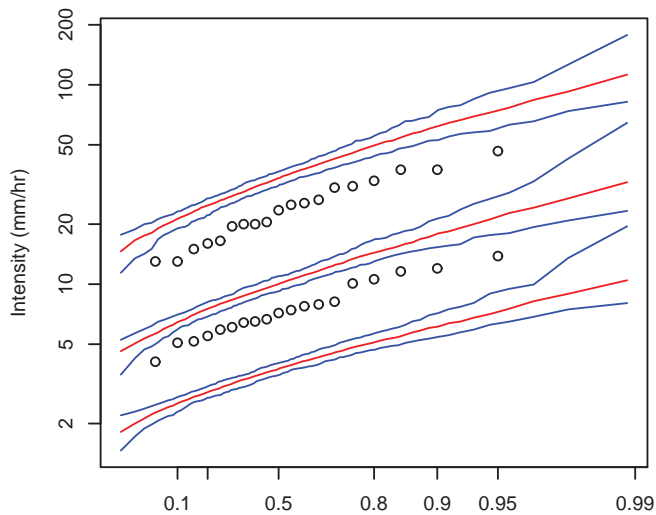
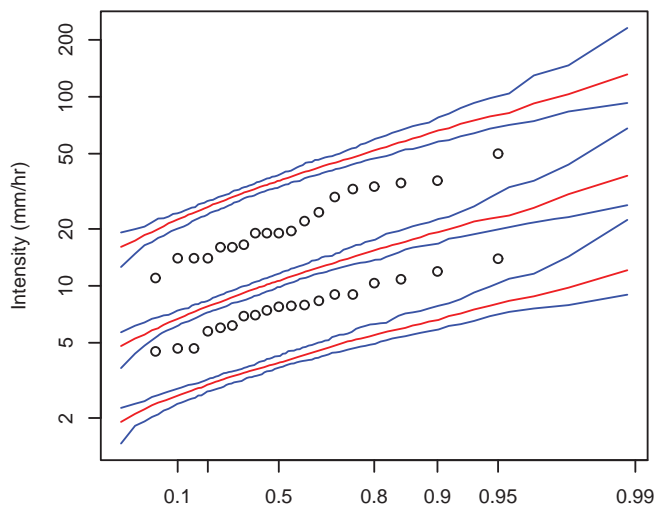


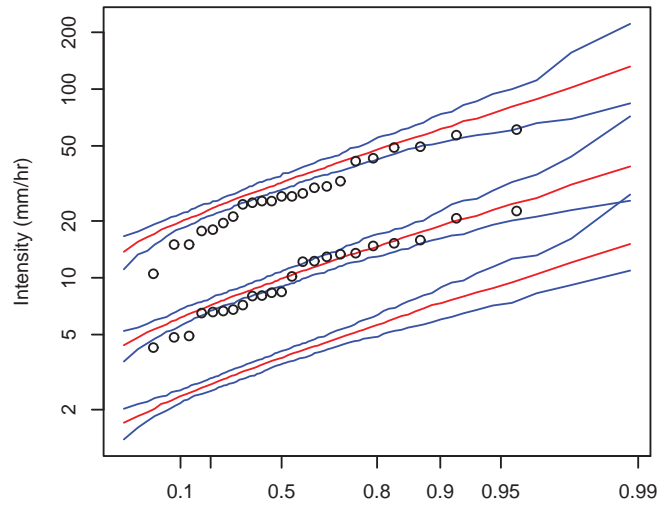
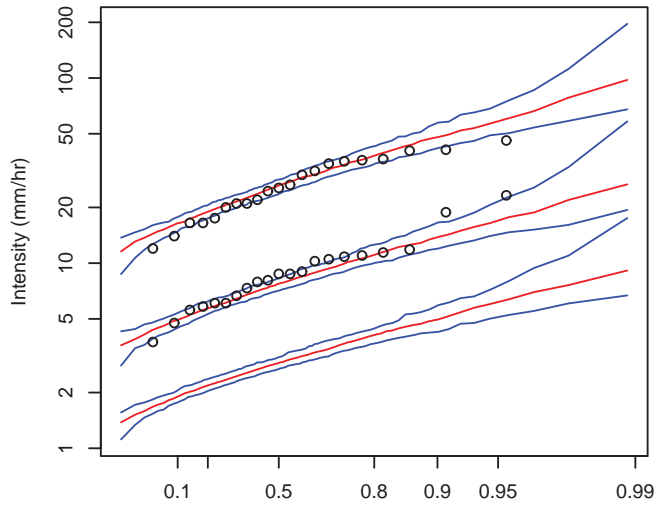
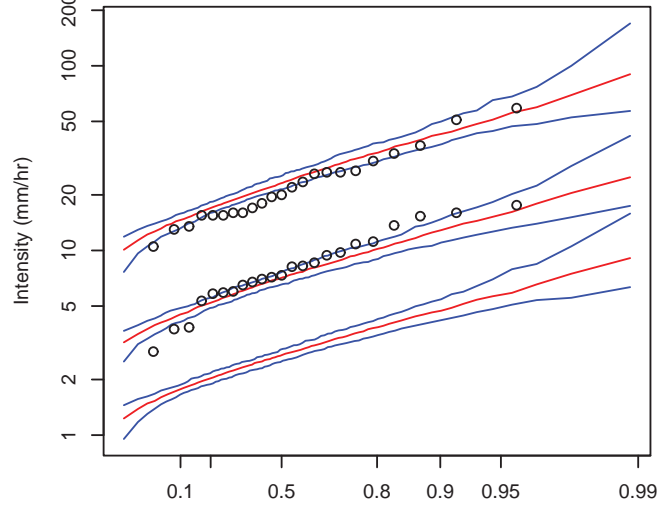
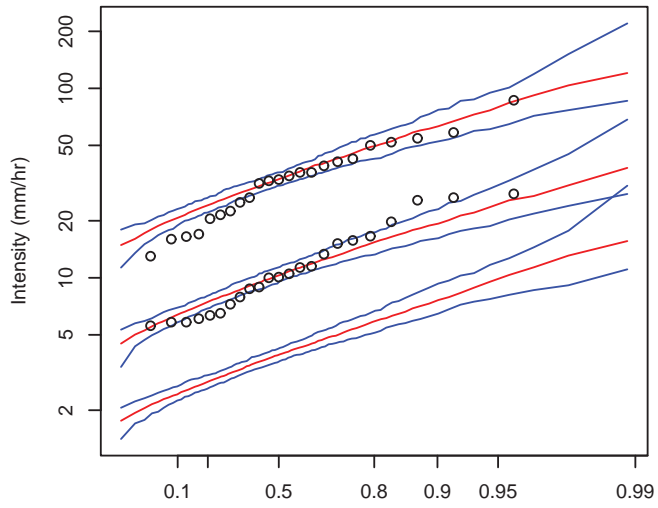
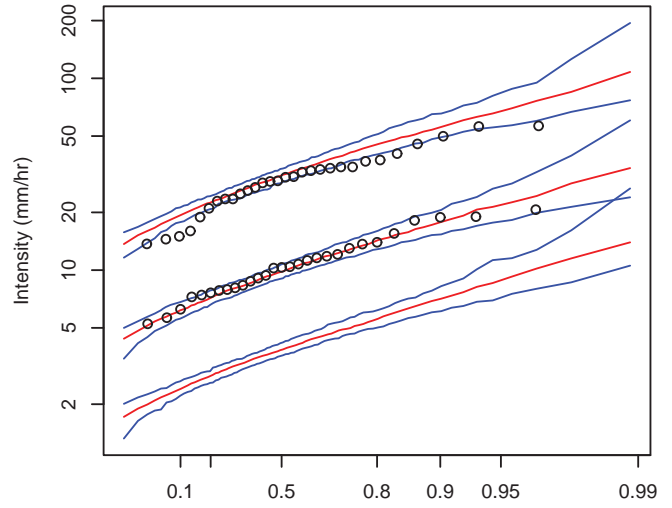
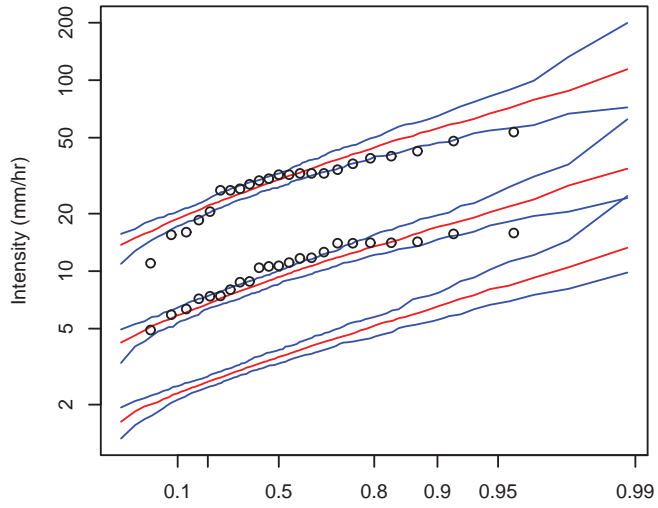


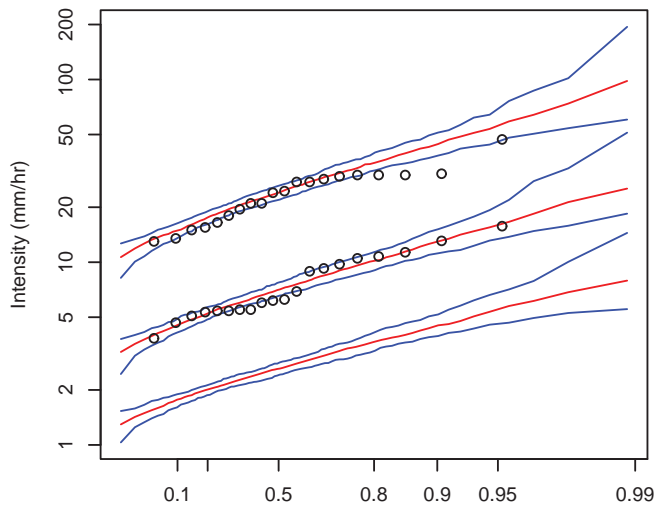
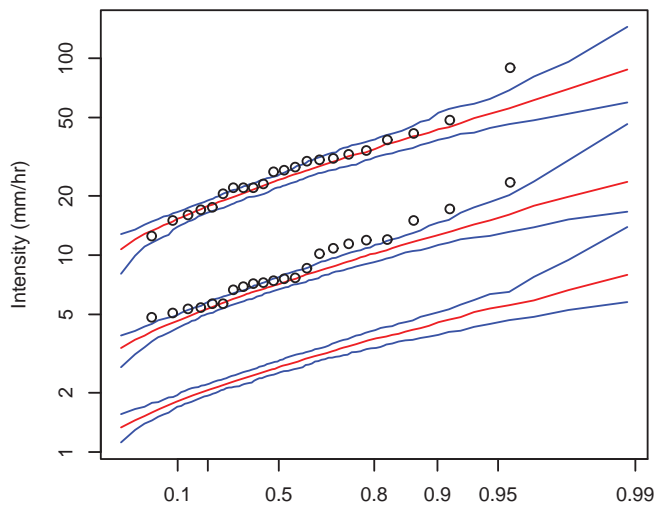
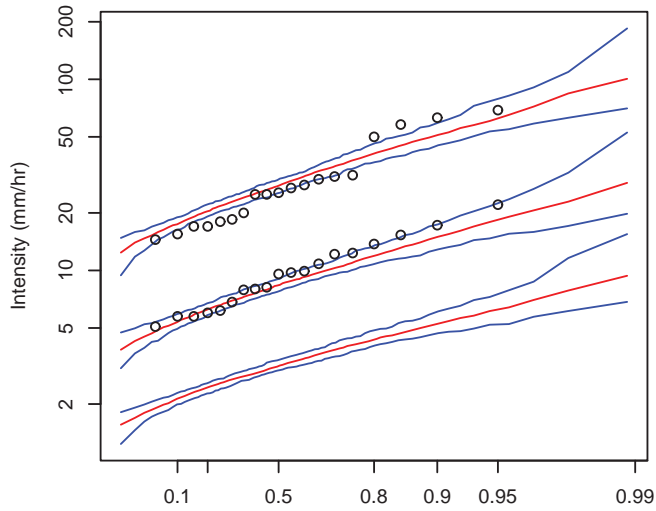
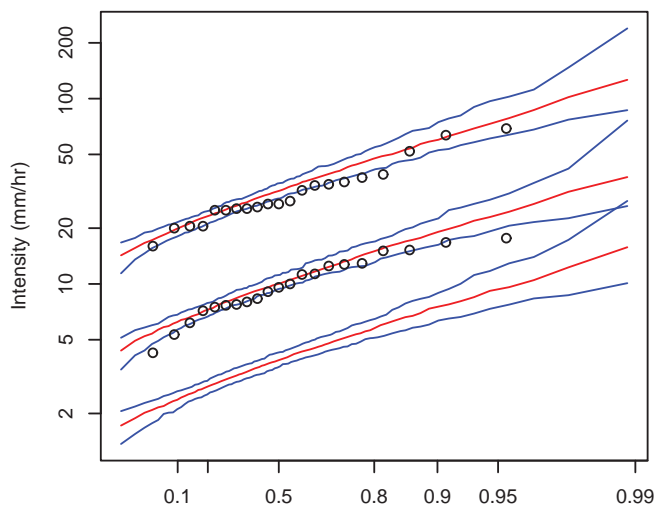
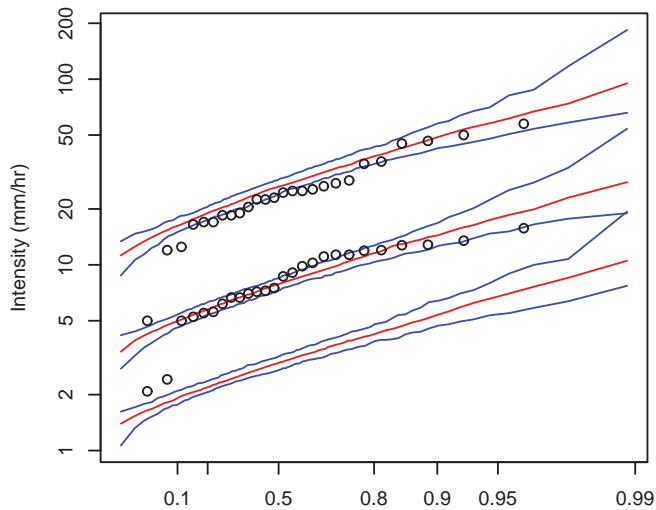
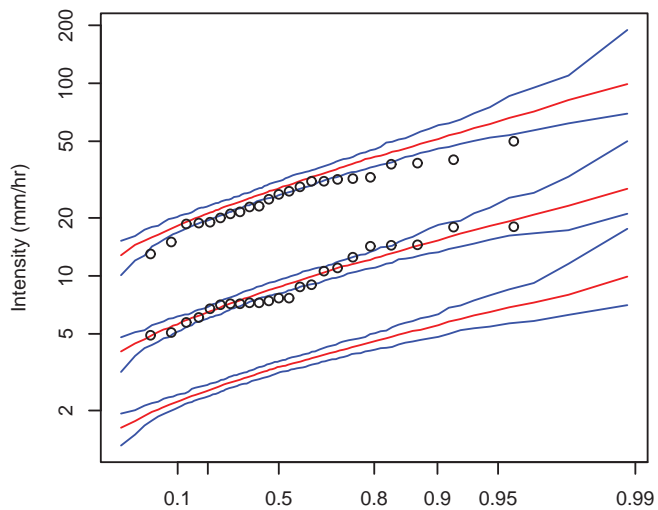
A.3 SIMULATED EXTREME VALUES

The following plots show the simulated distribution of extreme values compared to observed values, first for the 24 pluviograph gauges and secondly for the 52 daily rainfall sites. The plots correspond to the same order of sites as listed in Table A.1 and Table A.2 when read from left to right, top to bottom. The distributions are plotted against a Gumbel probability-axis. The lines correspond to 0.05, 0.5, 0.95 simulated order statistics at each quantile. For the pluviograph gauges the 1-hour and 6-hour extreme values are compared and for the daily sites the 24 hours extreme values are compared. To ensure a comparison of like-with-like, the simulated data was binned into 24-hour aggregates before extracting maxima.

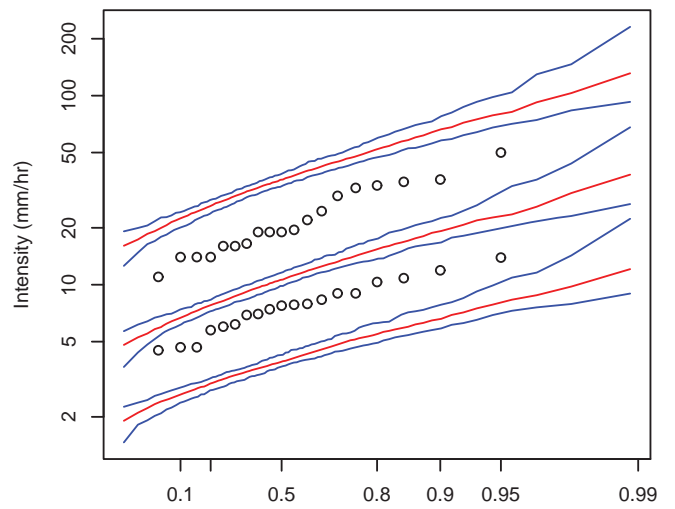
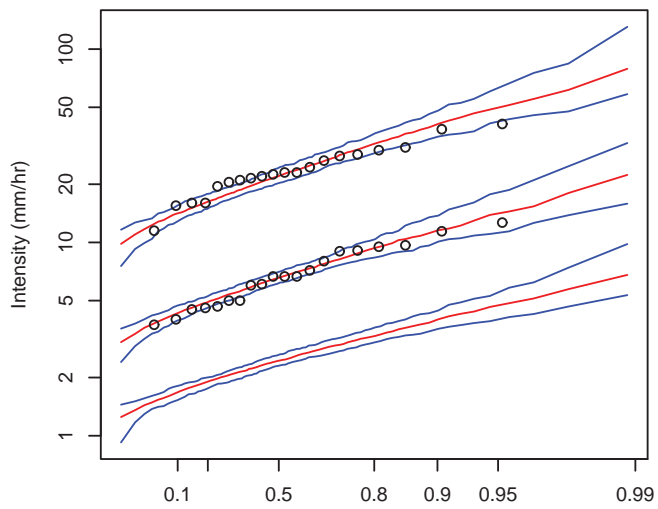
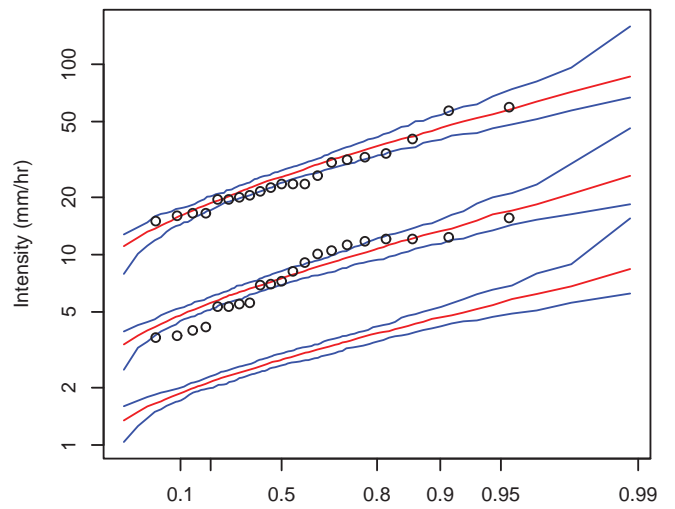
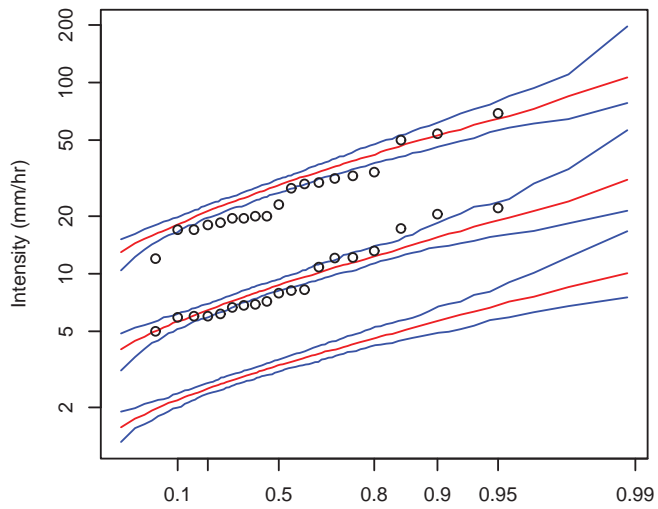
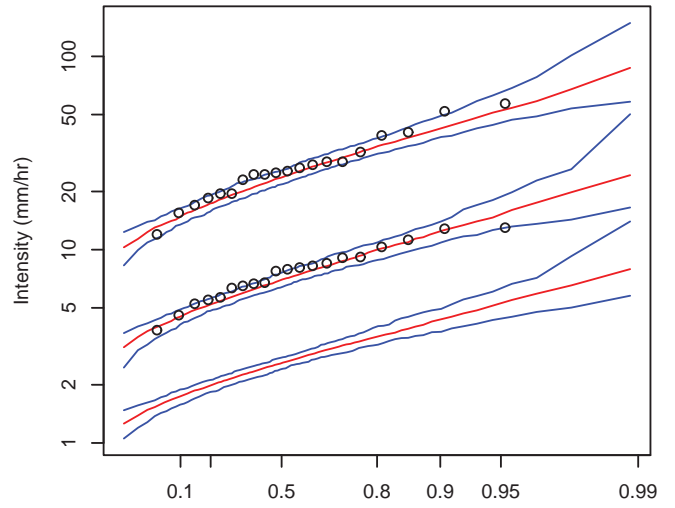
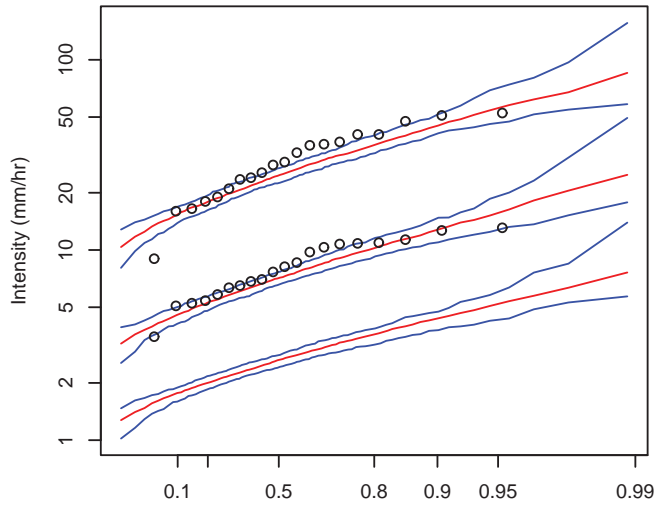
Extreme value distributions provide a good test of the model because they are not used in the calibration, and there is no parameter that directly ‘fixes’ an aspect of these distributions. The pluviograph gauges show a reasonable comparison for most, but not all gauges. At least three gauges consistently oversimulate the distribution of 1-hour and 6-hour extremes. The daily gauges are better in this regard, but the observed extremes exhibit a skewness that is not reproduced by the model (i.e. the mid-region of the simulated distribution is too low). There is considerable difficulty in improving these fit to these statistics, as gains in one statistic or at one site can yield poorer comparisons when inspecting other statistics or other sites.

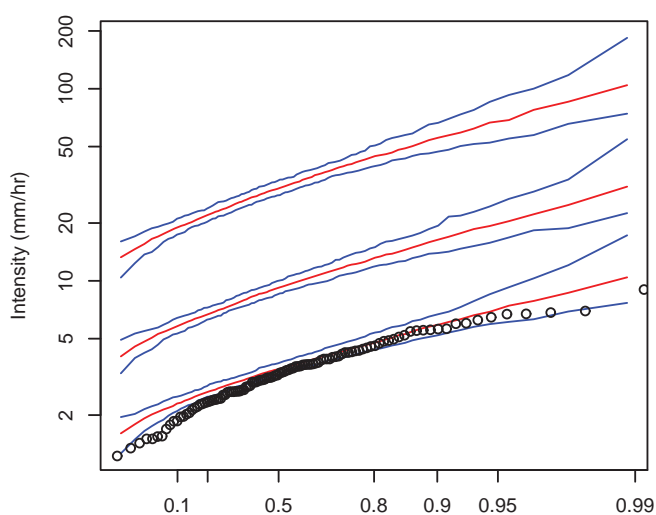
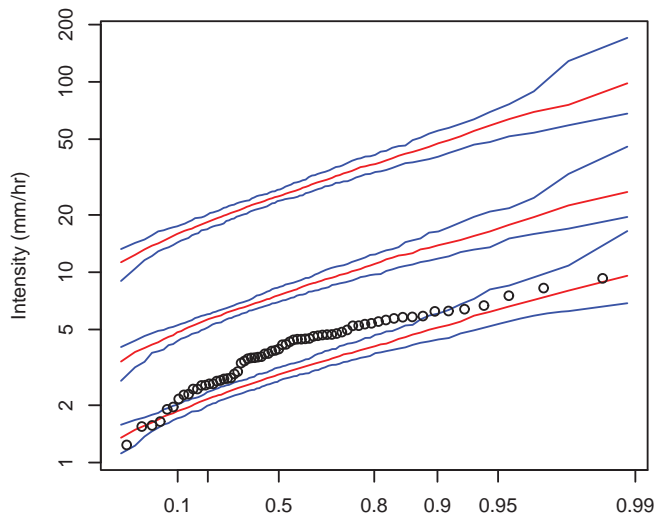
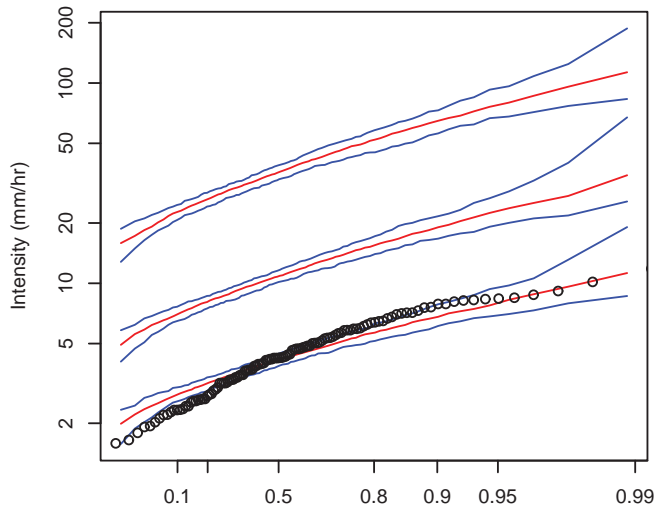
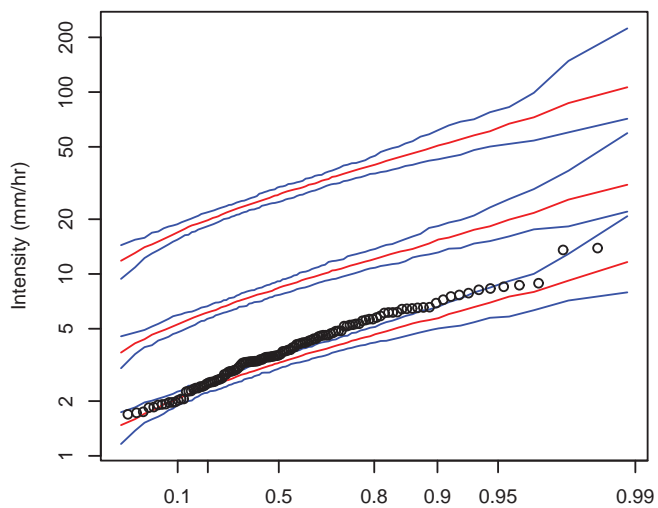
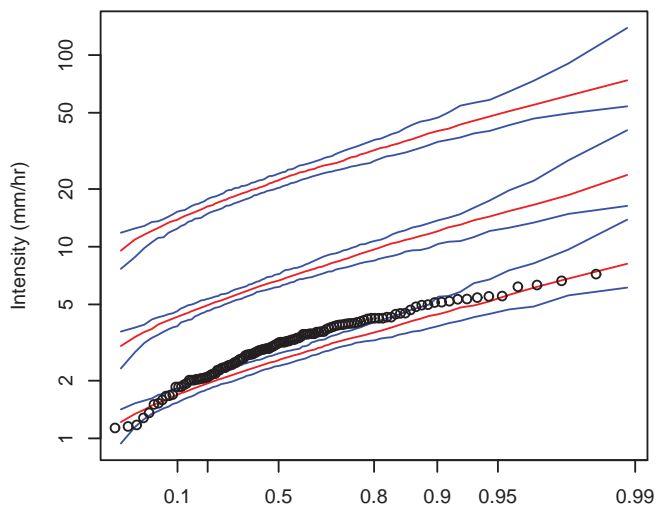
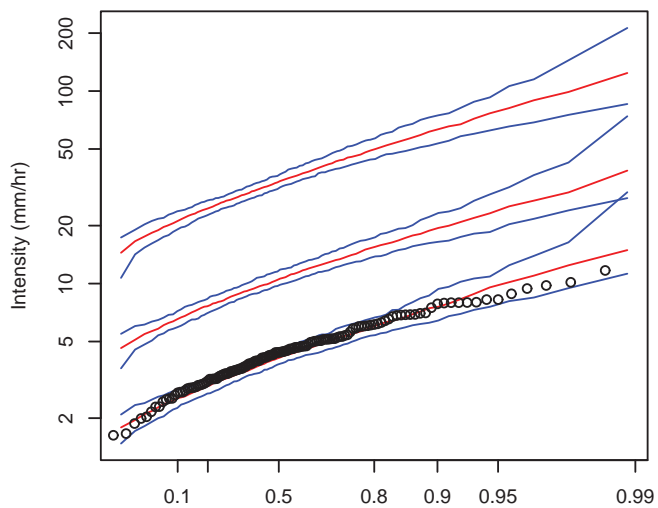




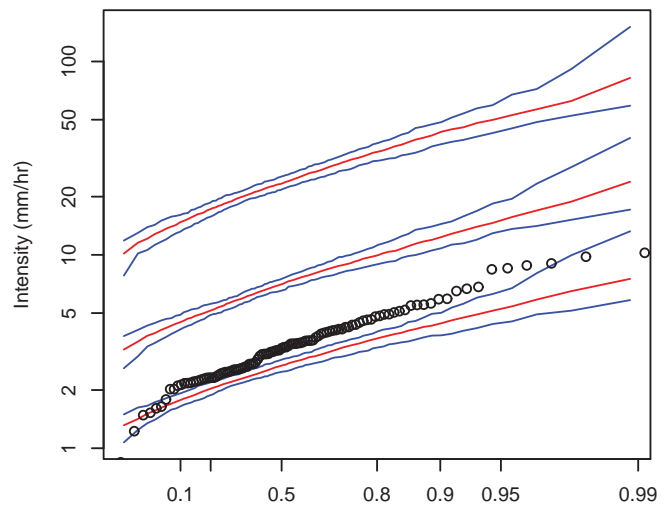
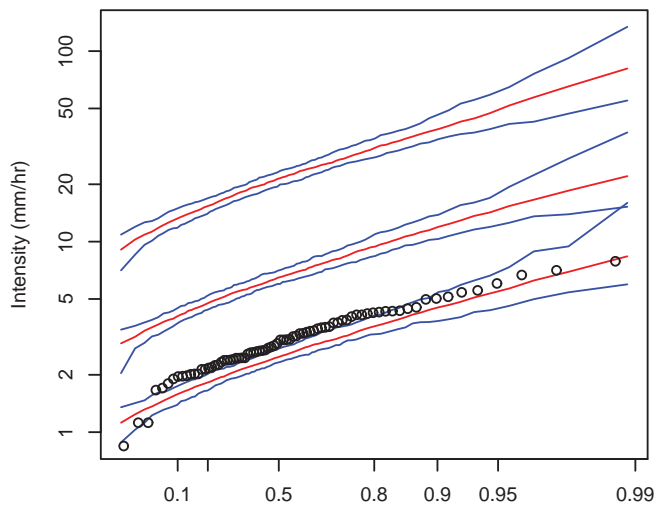
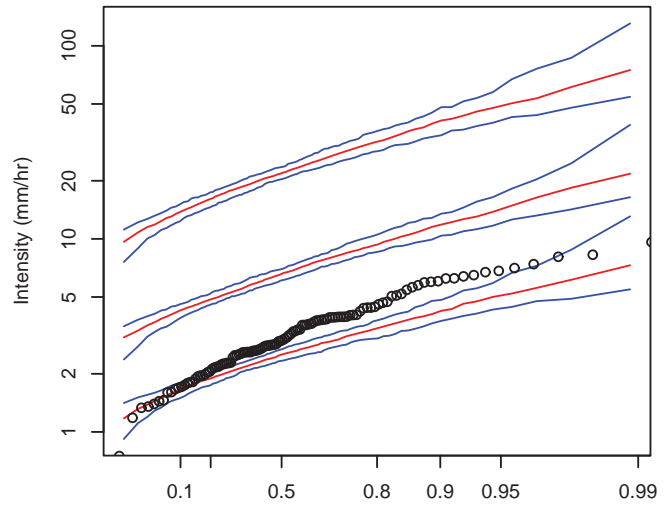
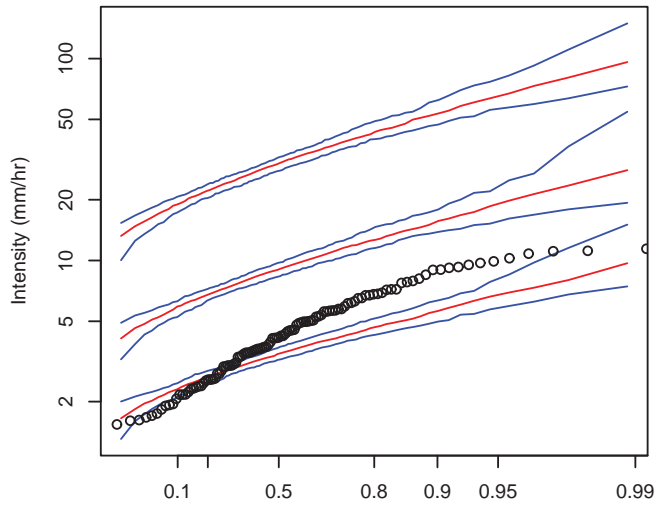
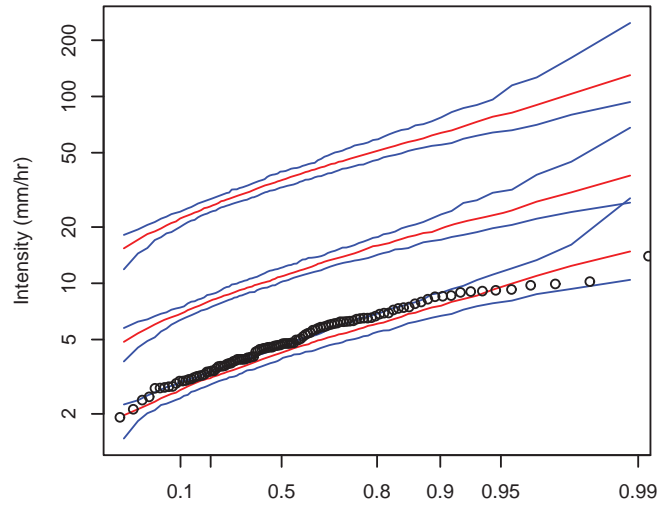
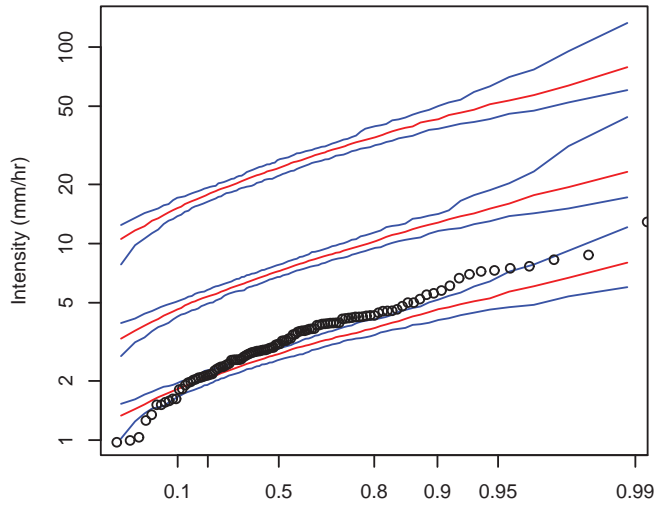


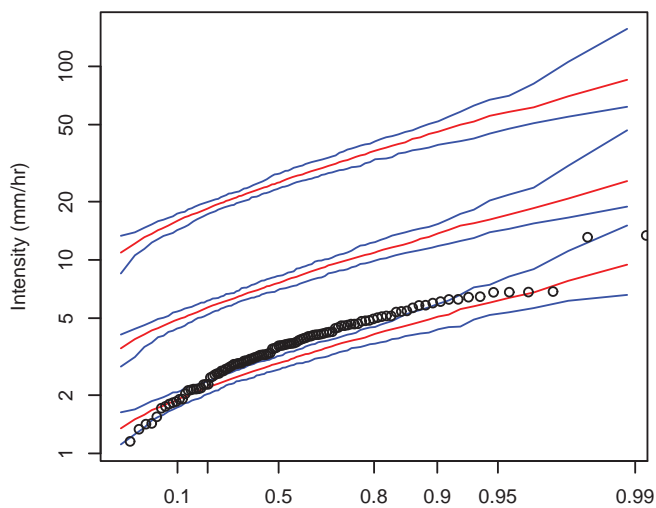
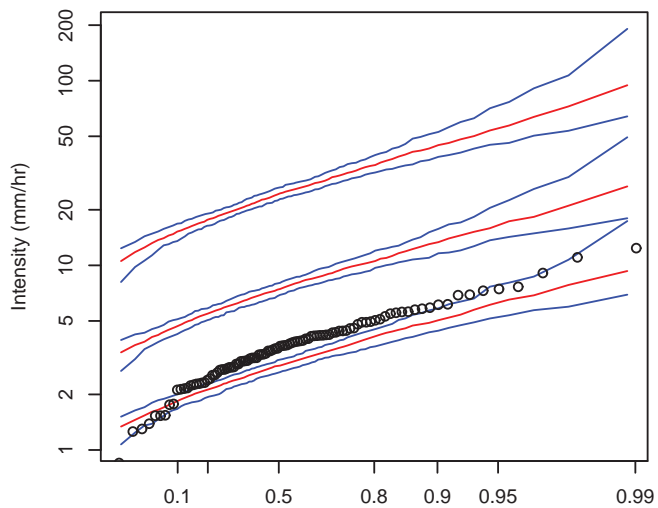
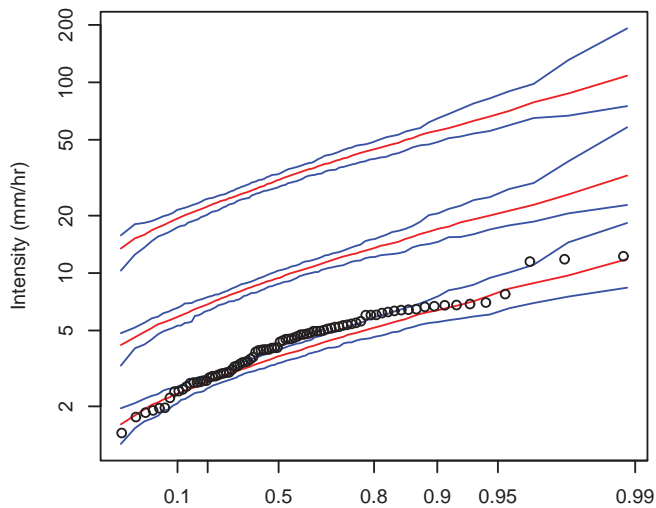
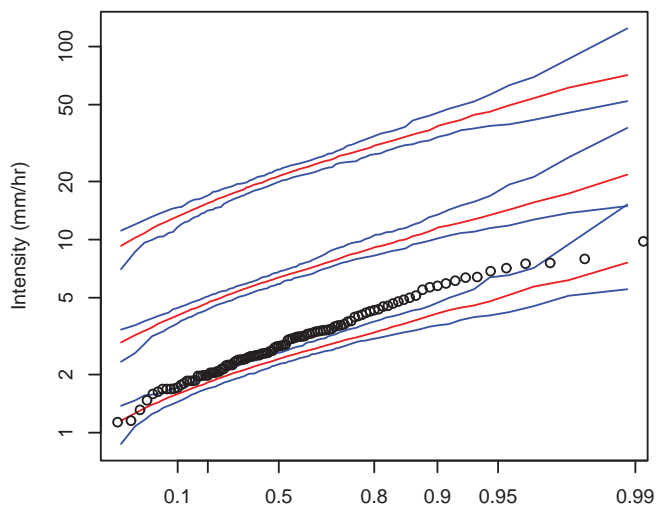
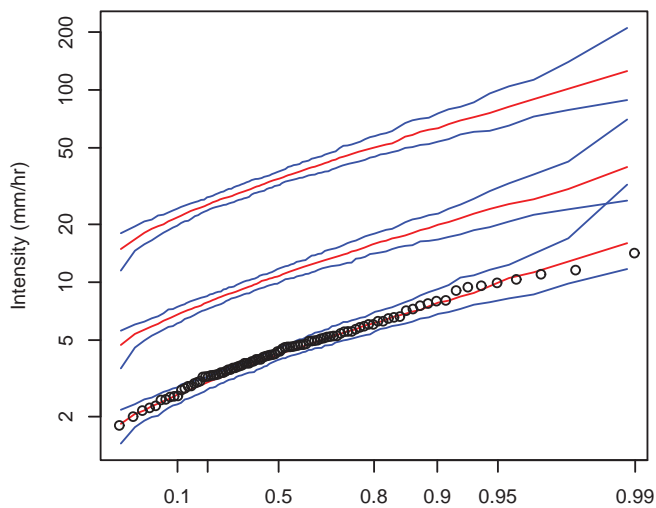
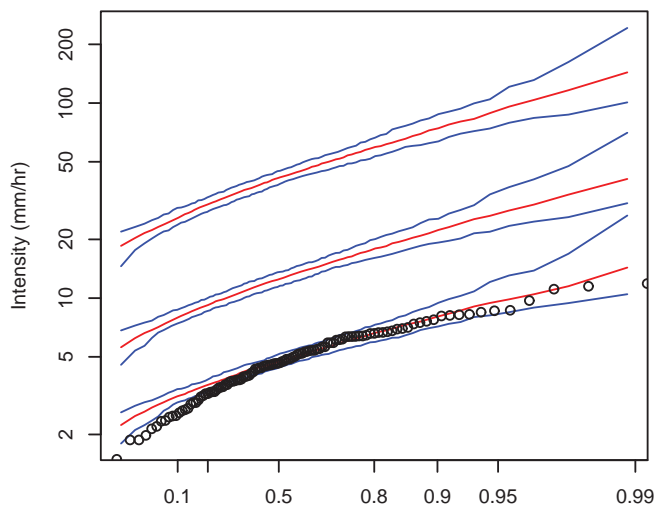
Appendix A – Spatial Storm Extent



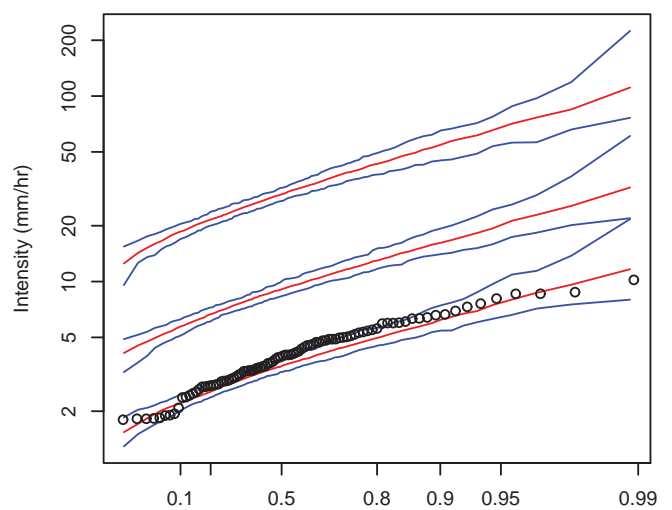
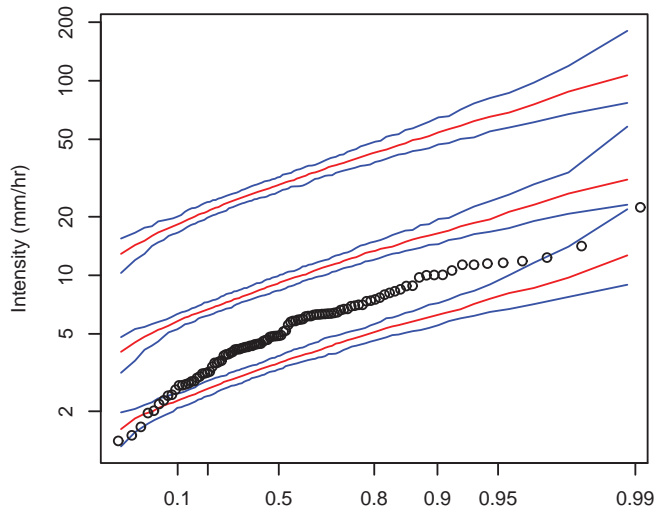
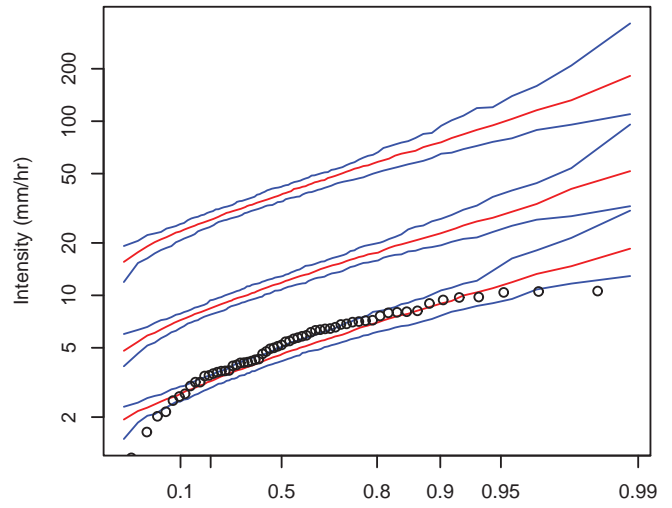
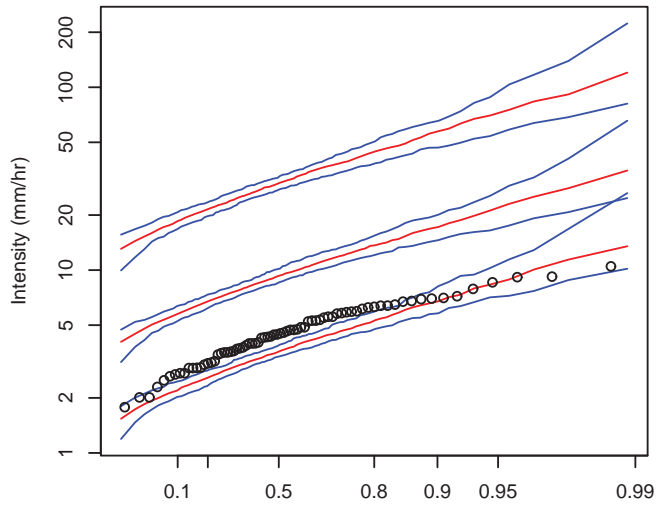
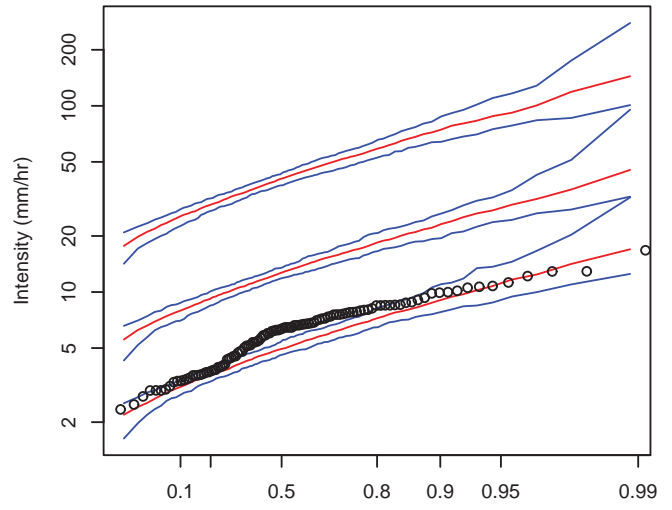
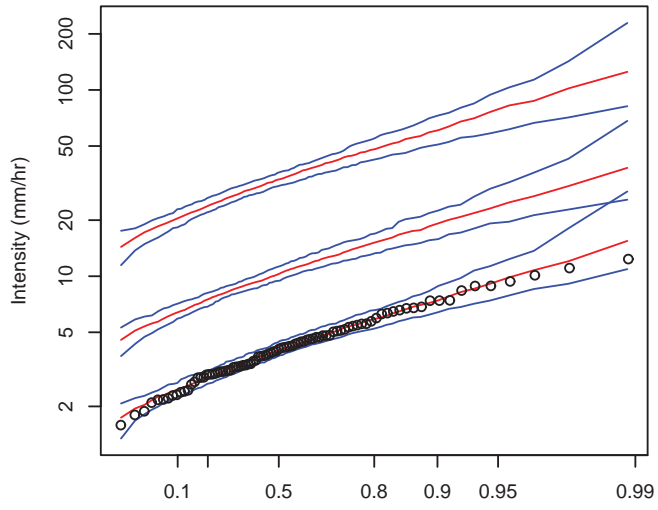


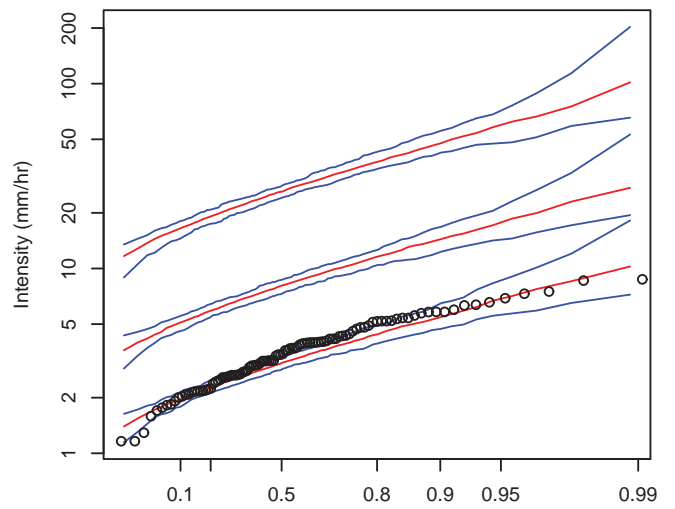
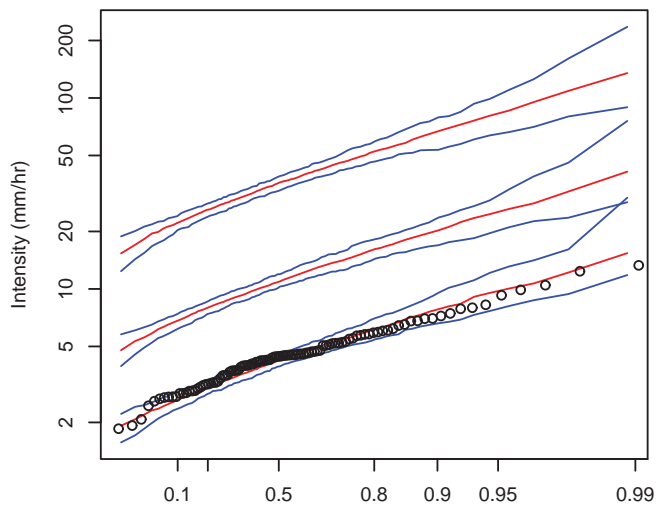
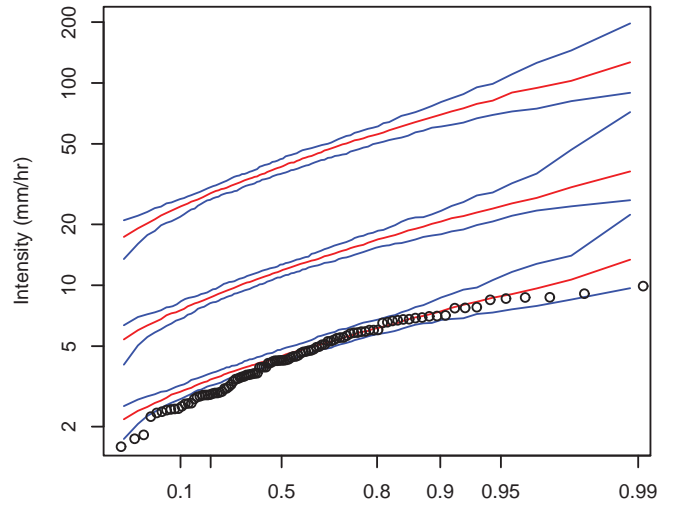
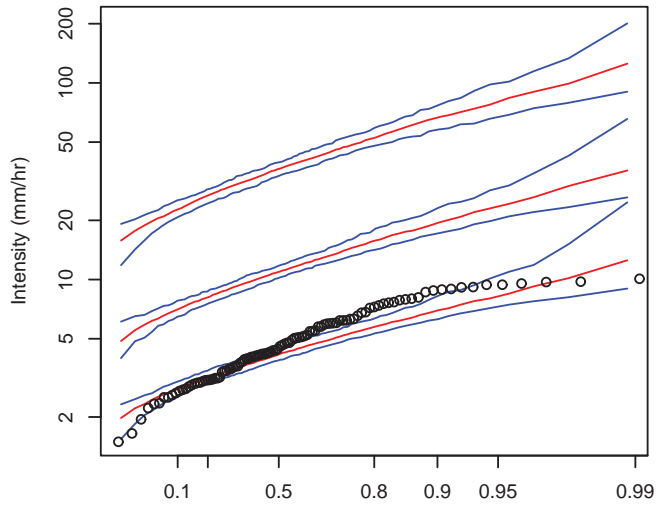
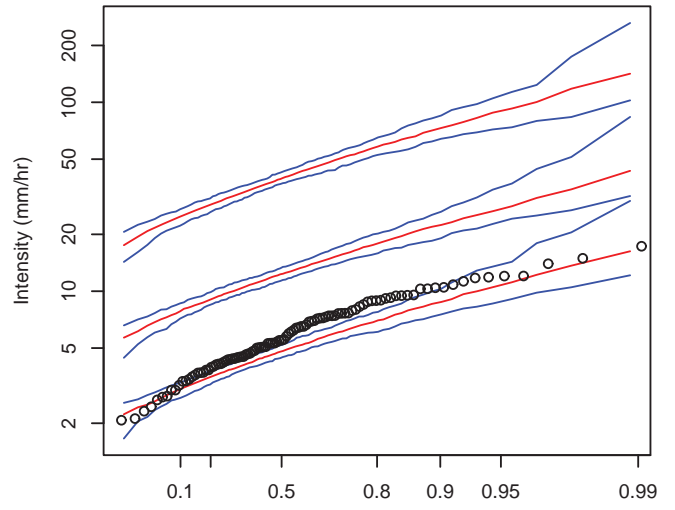
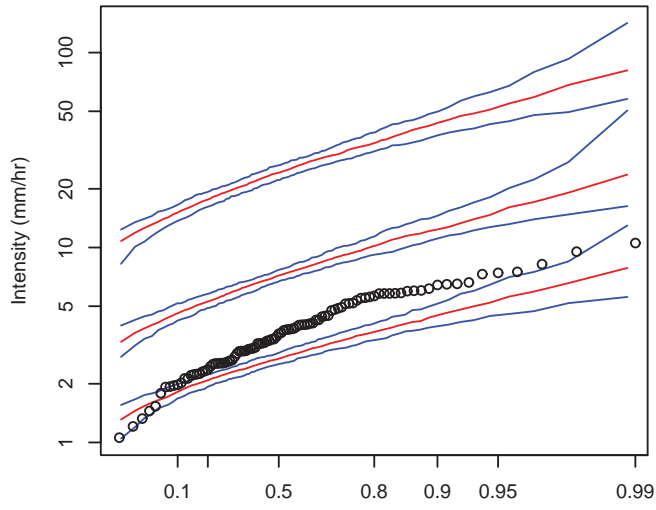
Appendix A – Spatial Storm Extent



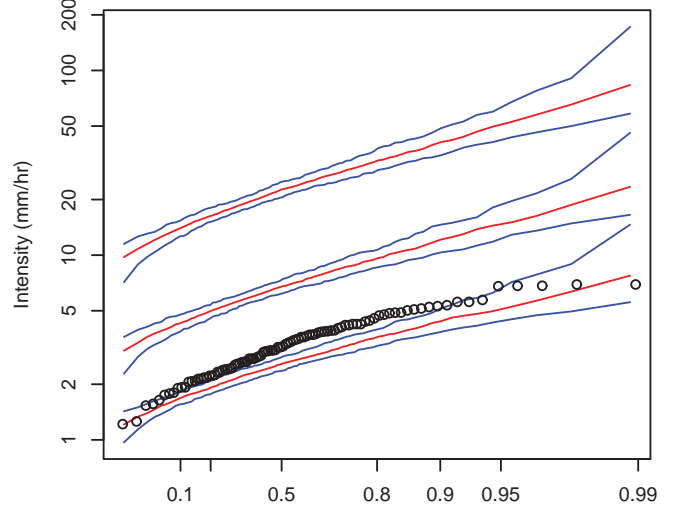
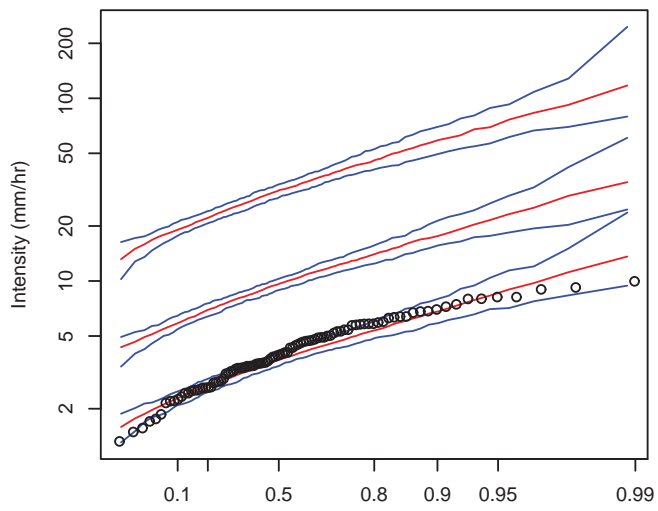
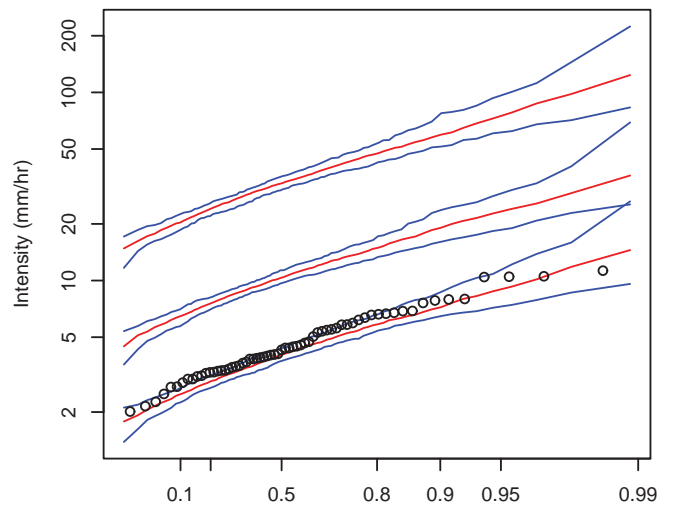
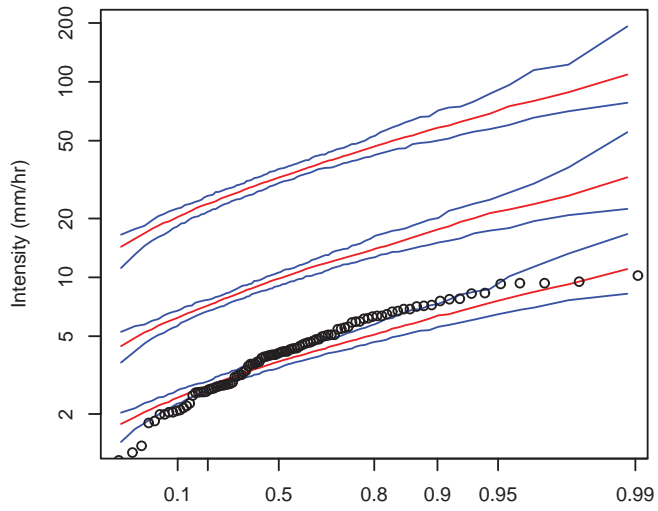
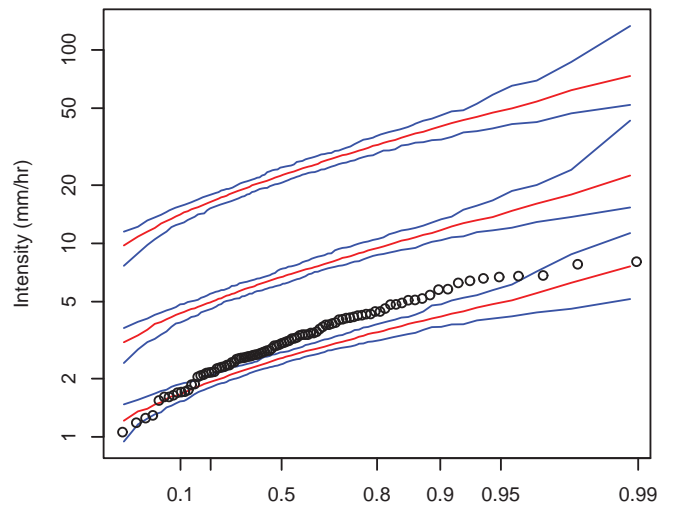
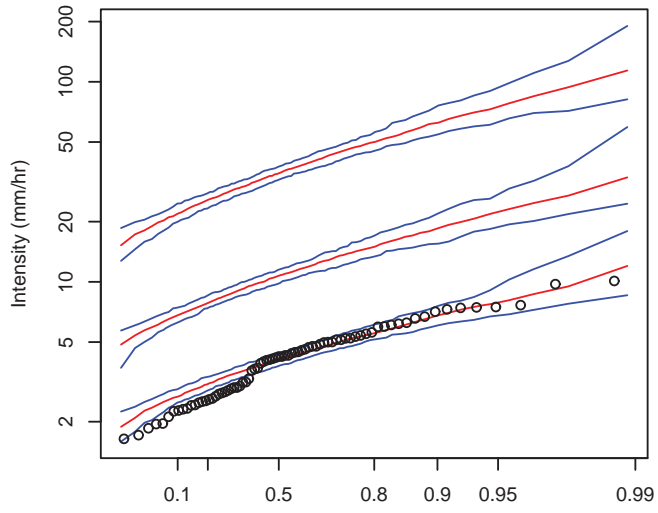


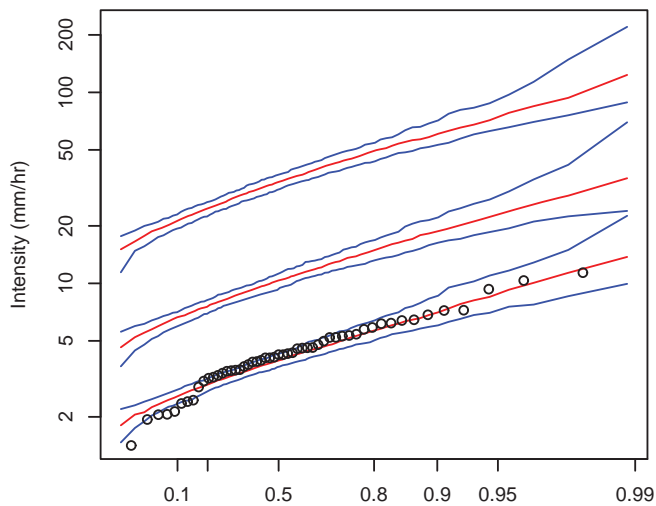
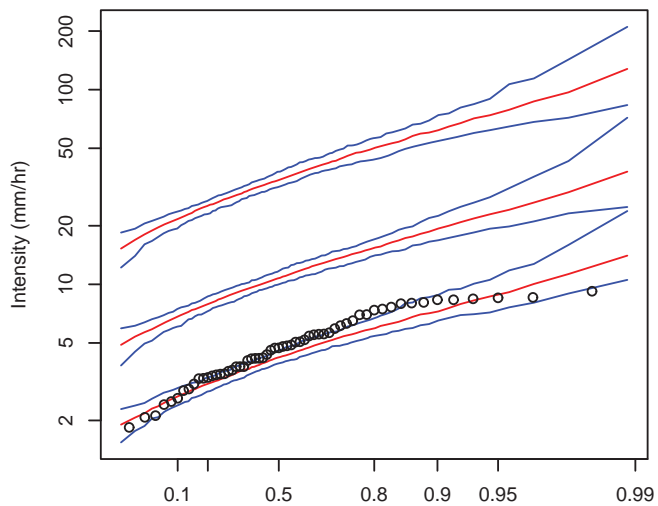
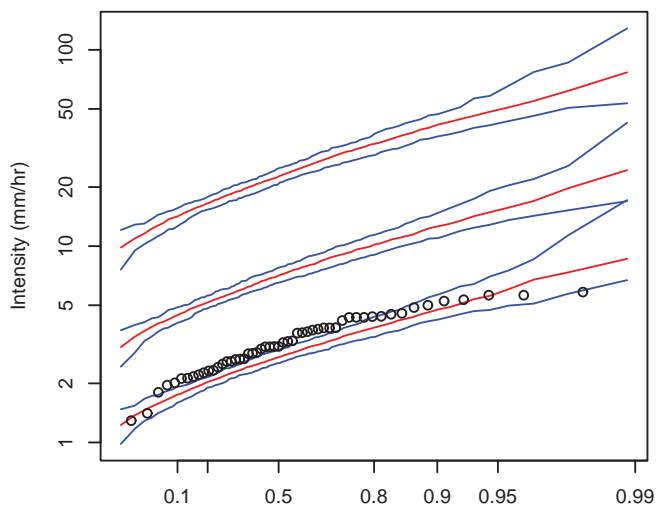
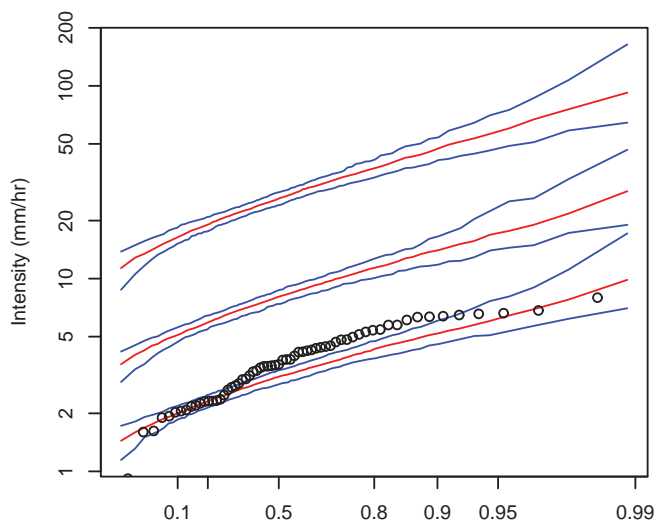
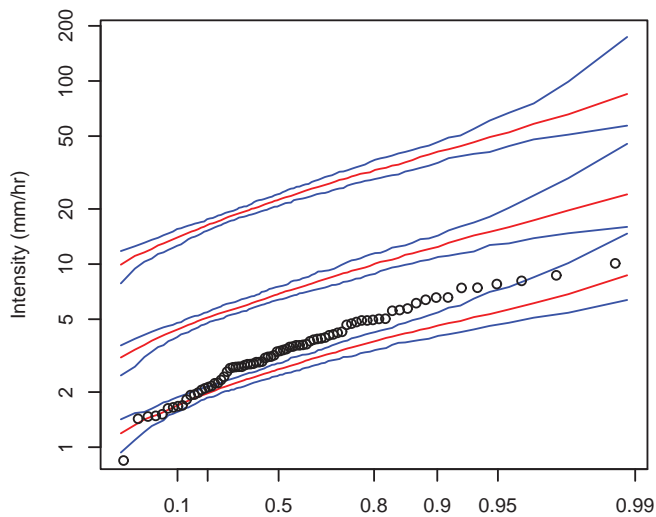
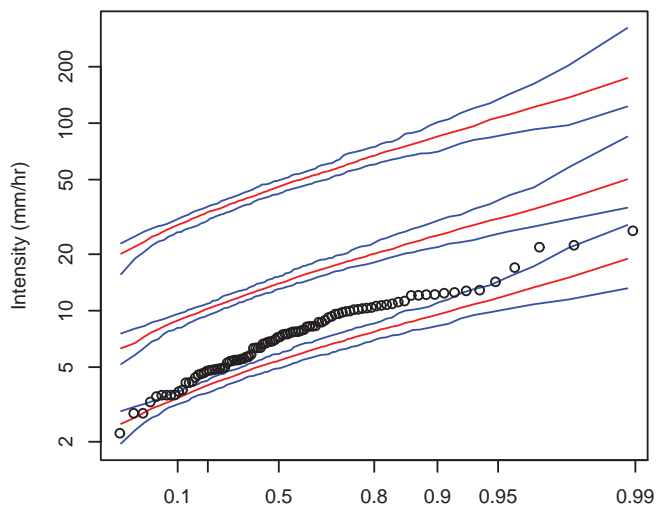
Appendix A – Spatial Storm Extent



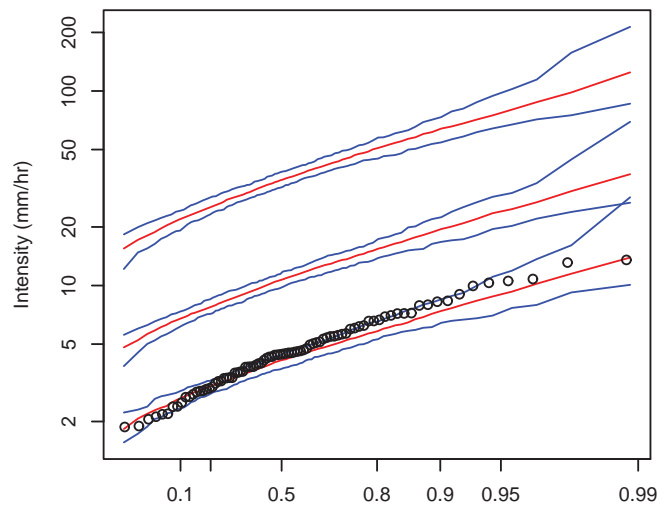
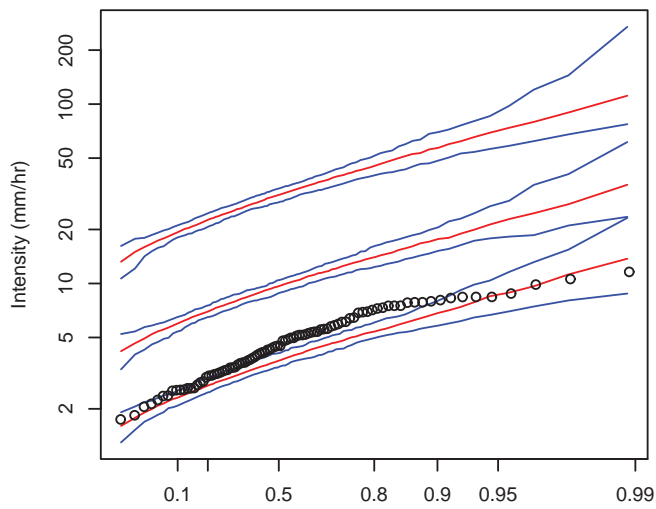
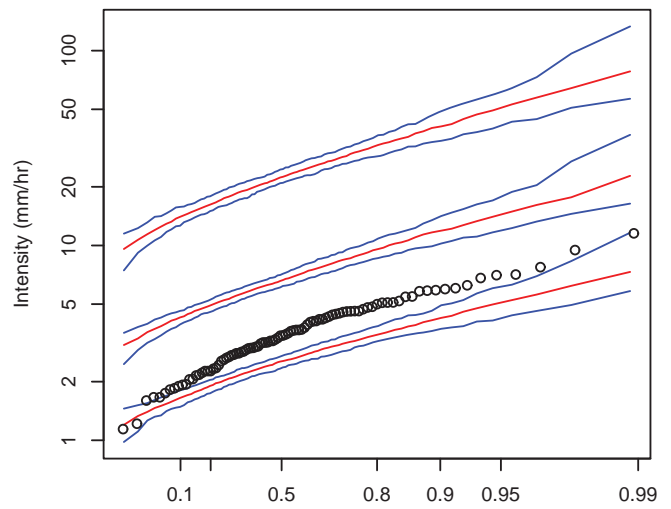
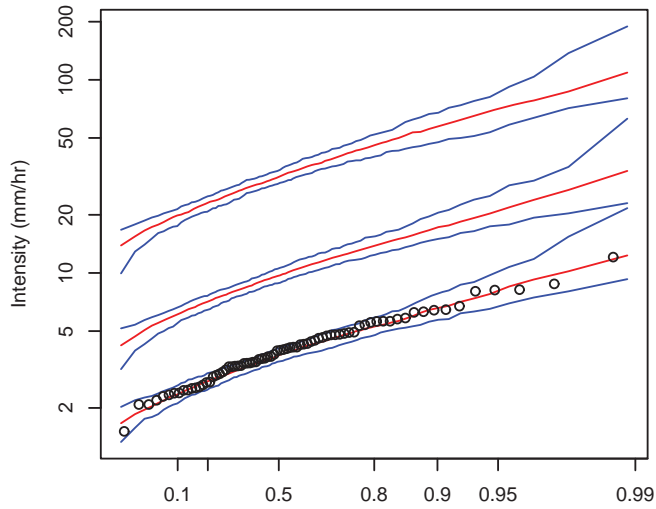
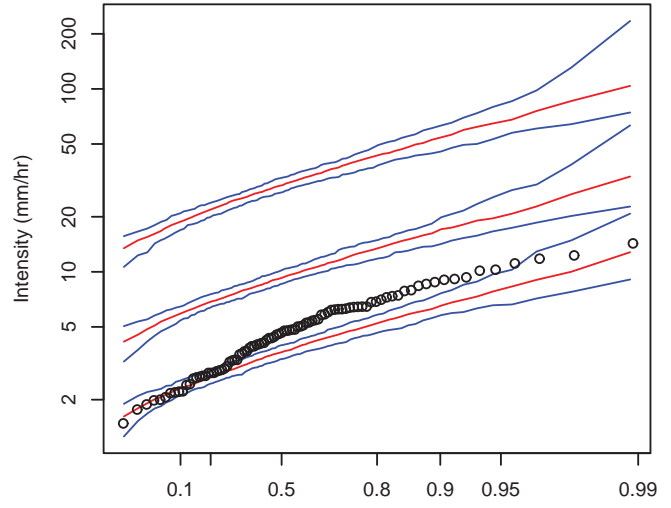
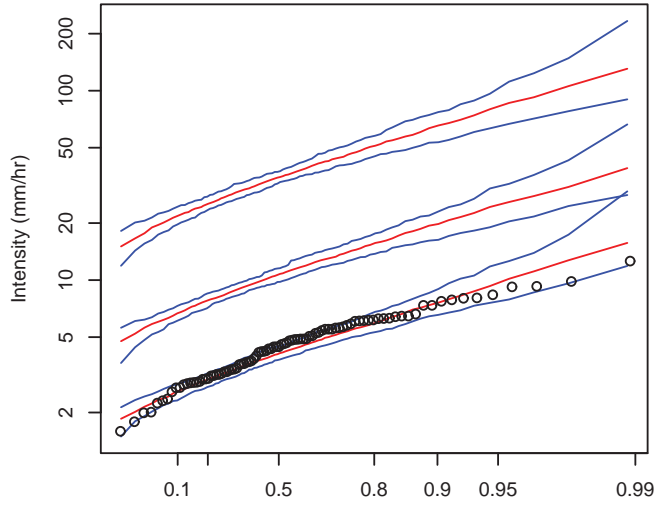


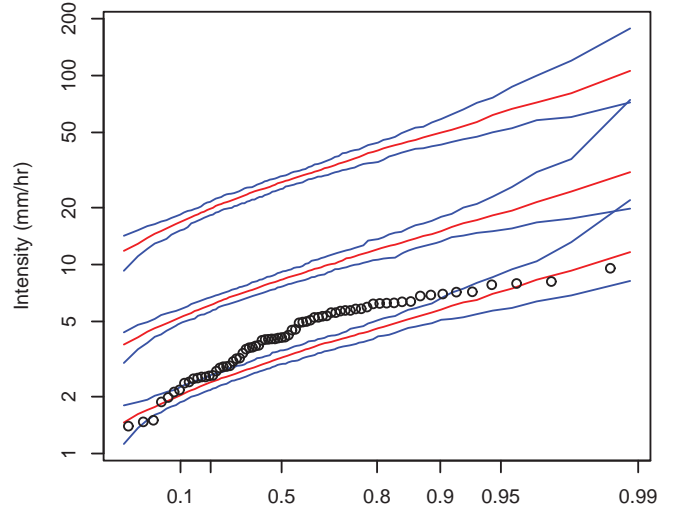
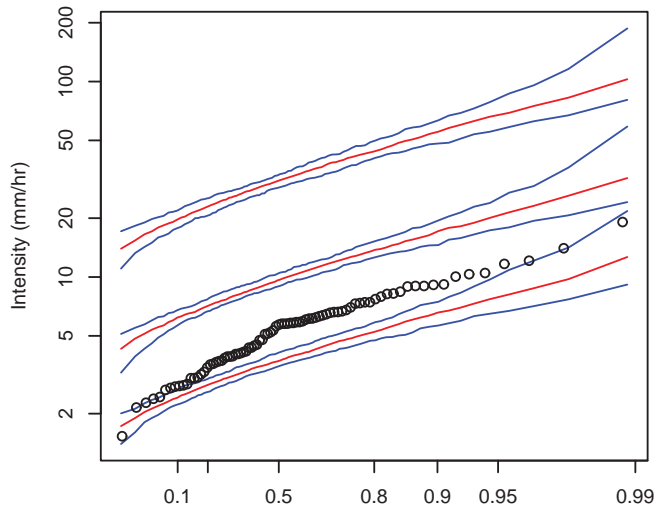
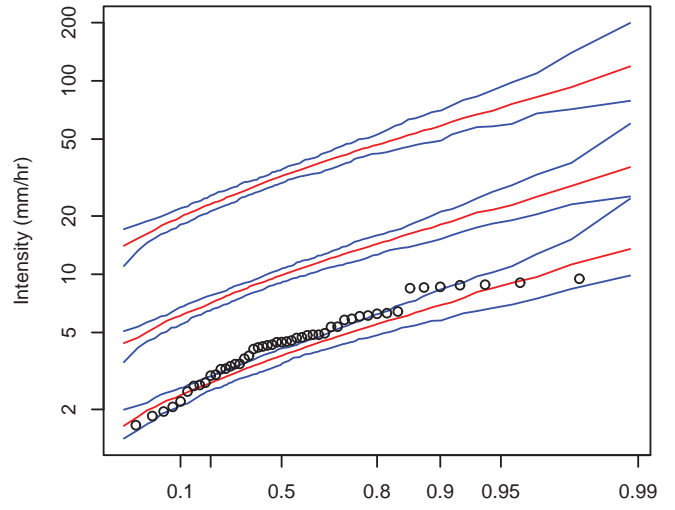
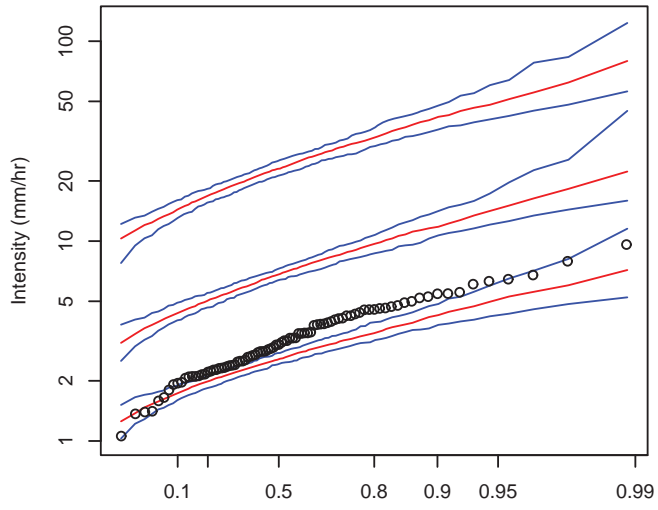
Appendix A – Spatial Storm Extent





Appendix A – Spatial Storm Extent





Appendix B

Bourke Case Study

B.1 OBSERVED SOI PARTITIONED ANNUAL EXTREMES

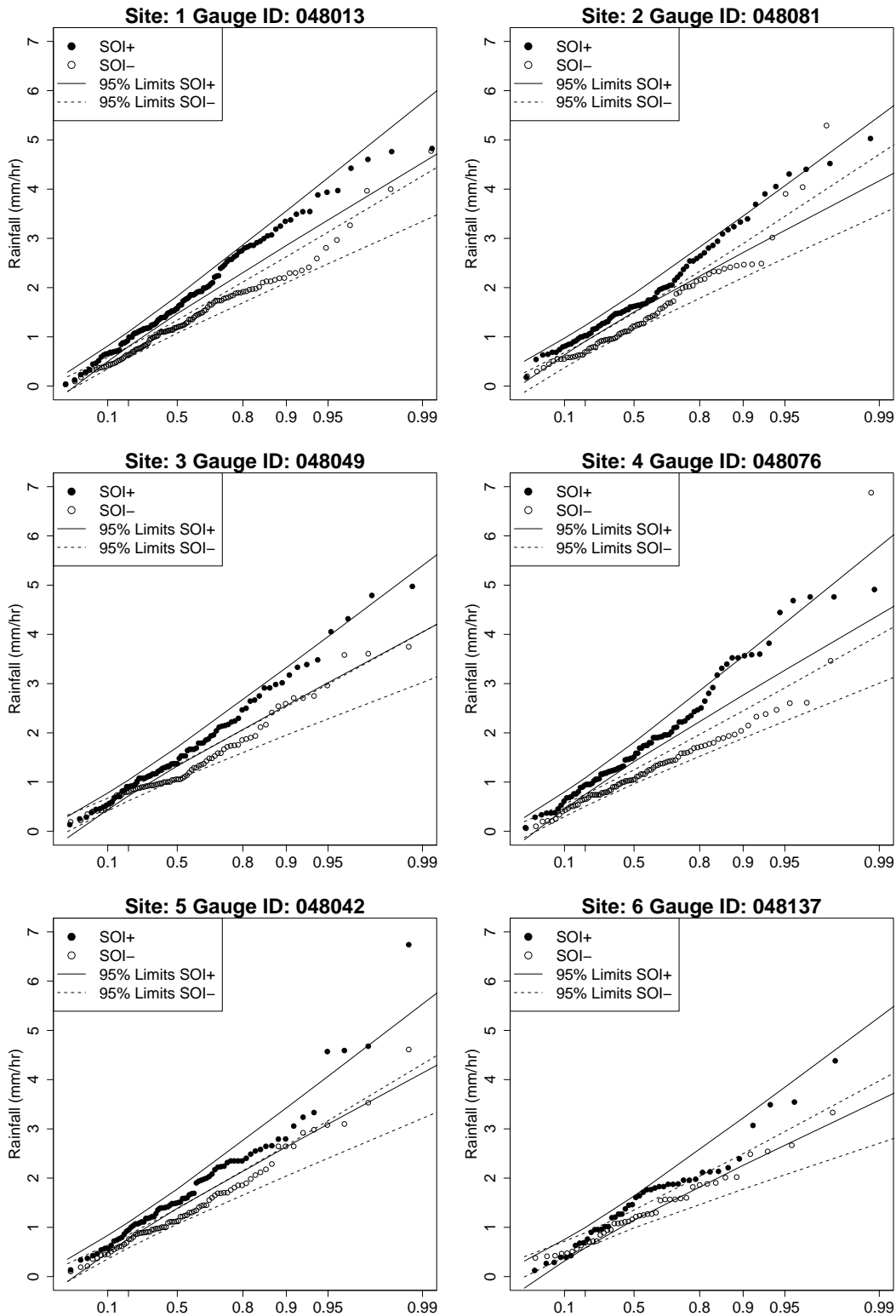


Figure B.1 Annual extremes of daily rainfall at Bourke partitioned by +ve/-ve phases of the SOI. Probabilities shown using a Gumbel axis. 95% Confidence intervals obtained from the distribution of estimates of the Gumbel parameters.

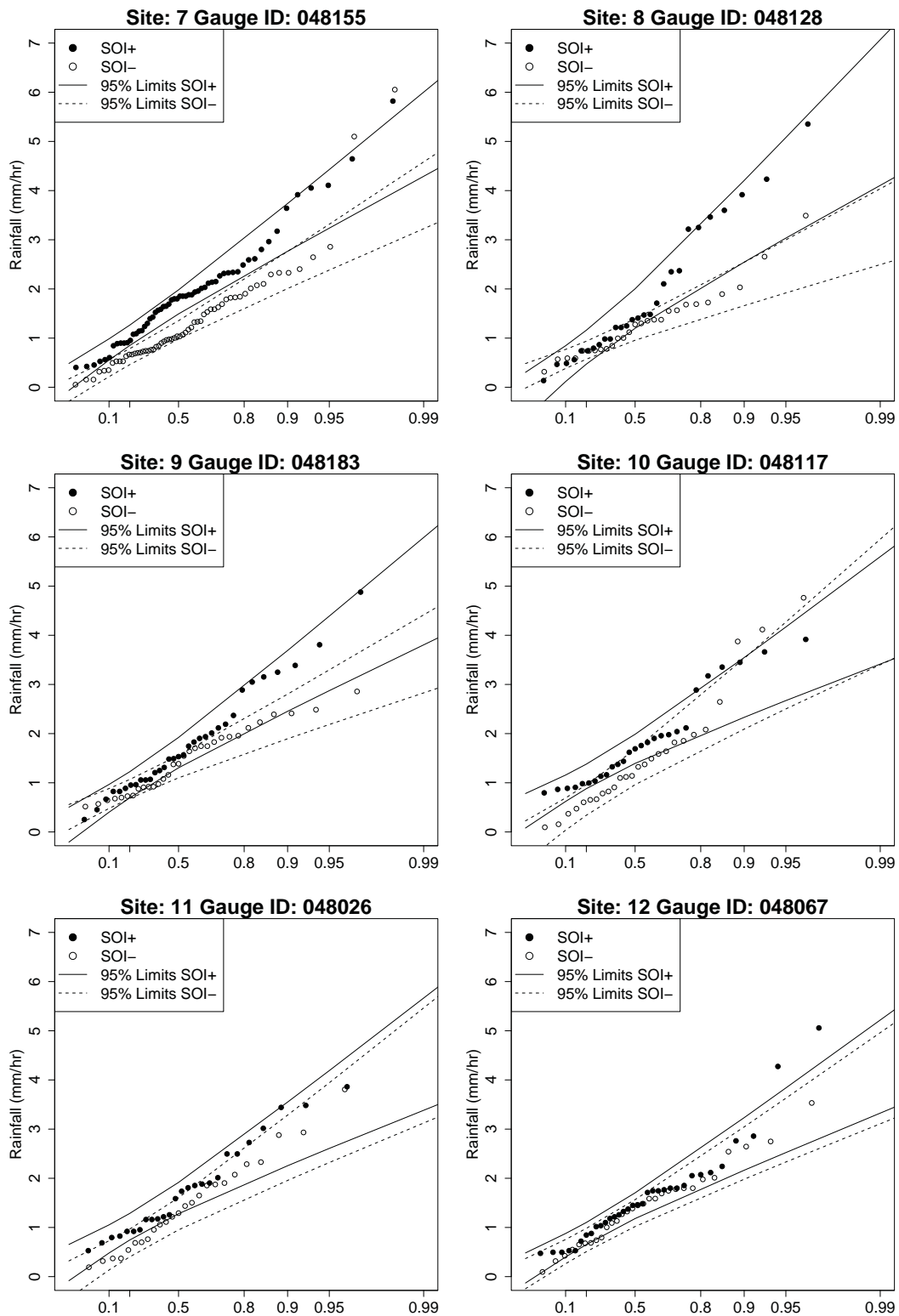


Figure B.2 Annual extremes of daily rainfall at Bourke partitioned by +ve/-ve phases of the SOI. Probabilities shown using a Gumbel axis. 95% Confidence intervals obtained from the distribution of estimates of the Gumbel parameters.

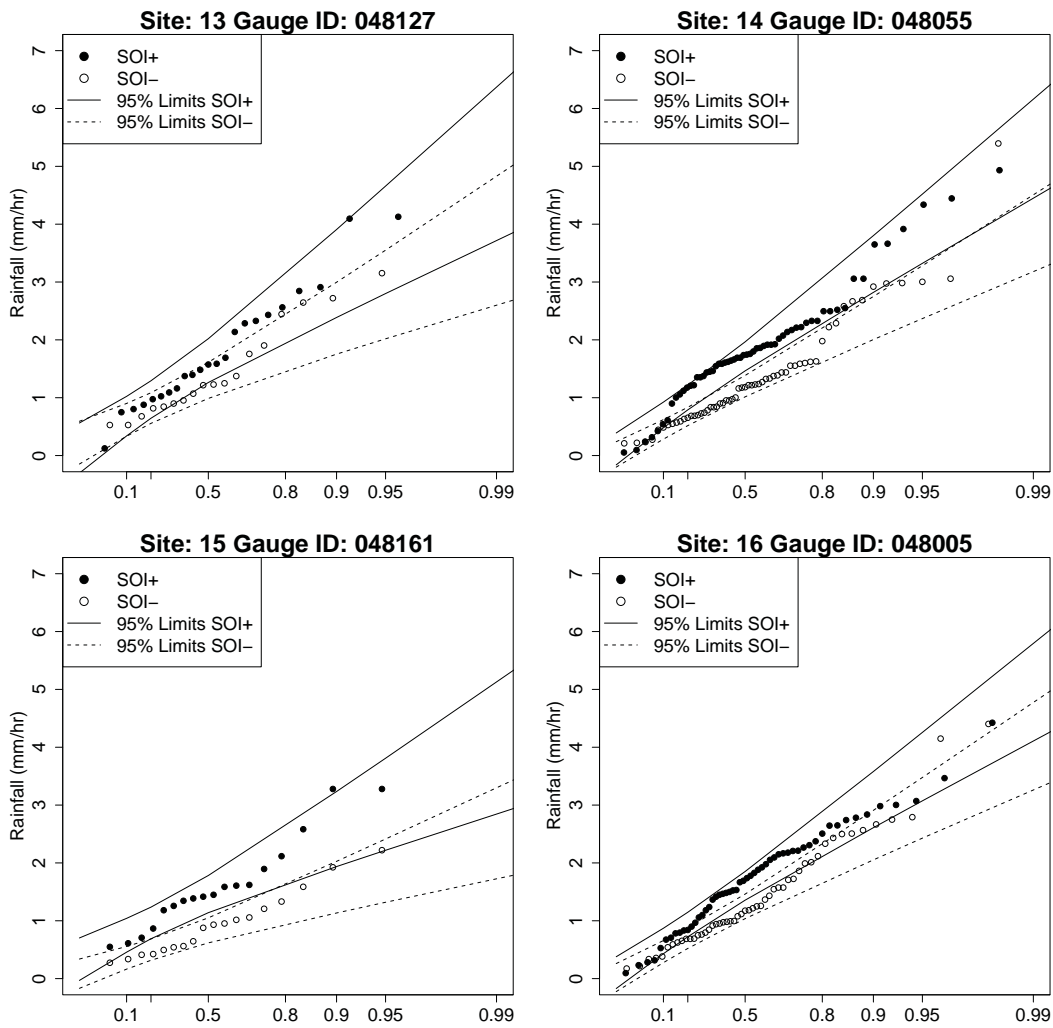


Figure B.3 Annual extremes of daily rainfall at Bourke partitioned by +ve/-ve phases of the SOI. Probabilities shown using a Gumbel axis. 95% Confidence intervals obtained from the distribution of estimates of the Gumbel parameters.

B.2 OBSERVED SOI PARTITIONED SUMMER EXTREMES

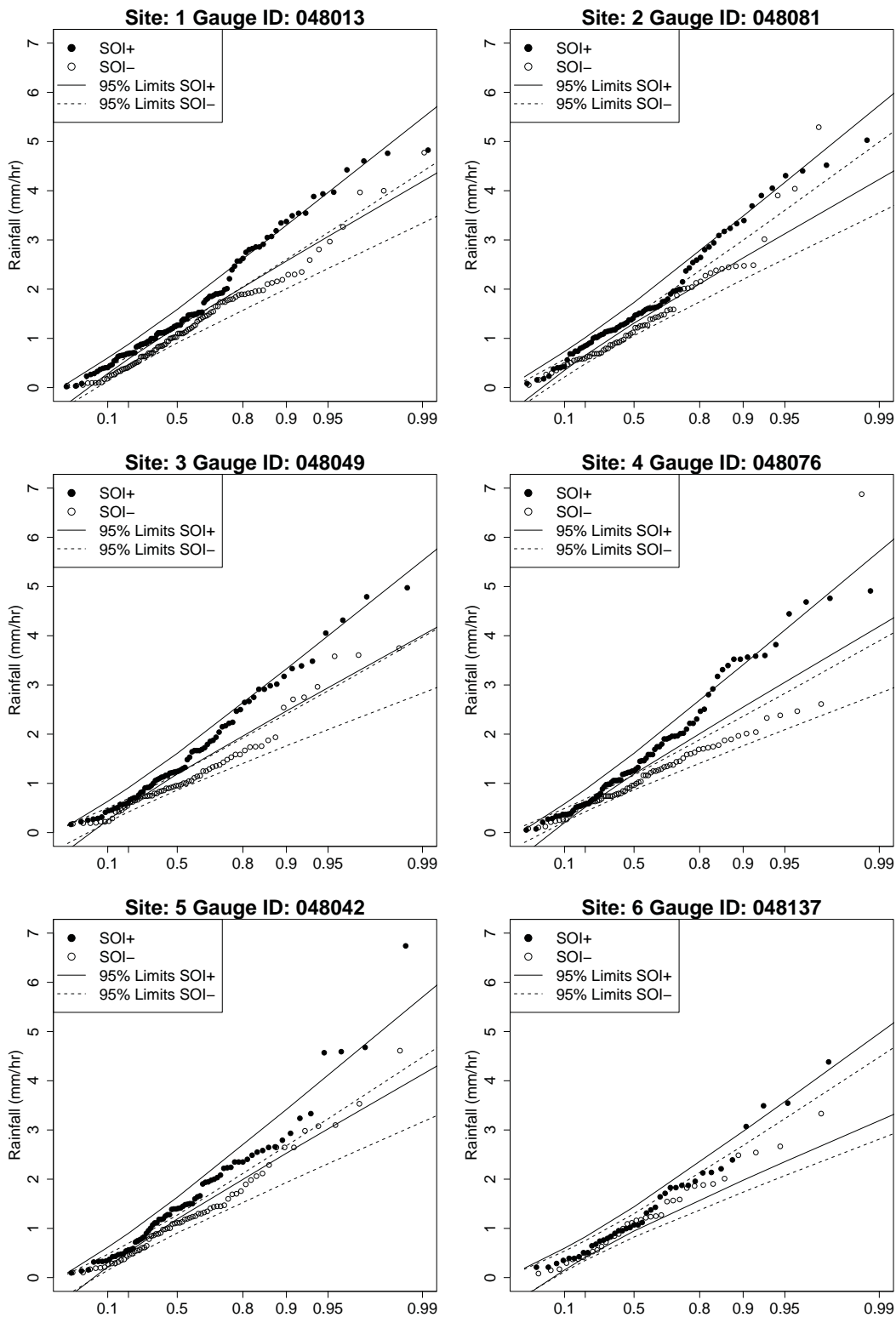


Figure B.4 Summer extremes of daily rainfall at Bourke partitioned by +ve/-ve phases of the SOI. Probabilities shown using a Gumbel axis. 95% Confidence intervals obtained from the distribution of estimates of the Gumbel parameters. Sites 1-6.

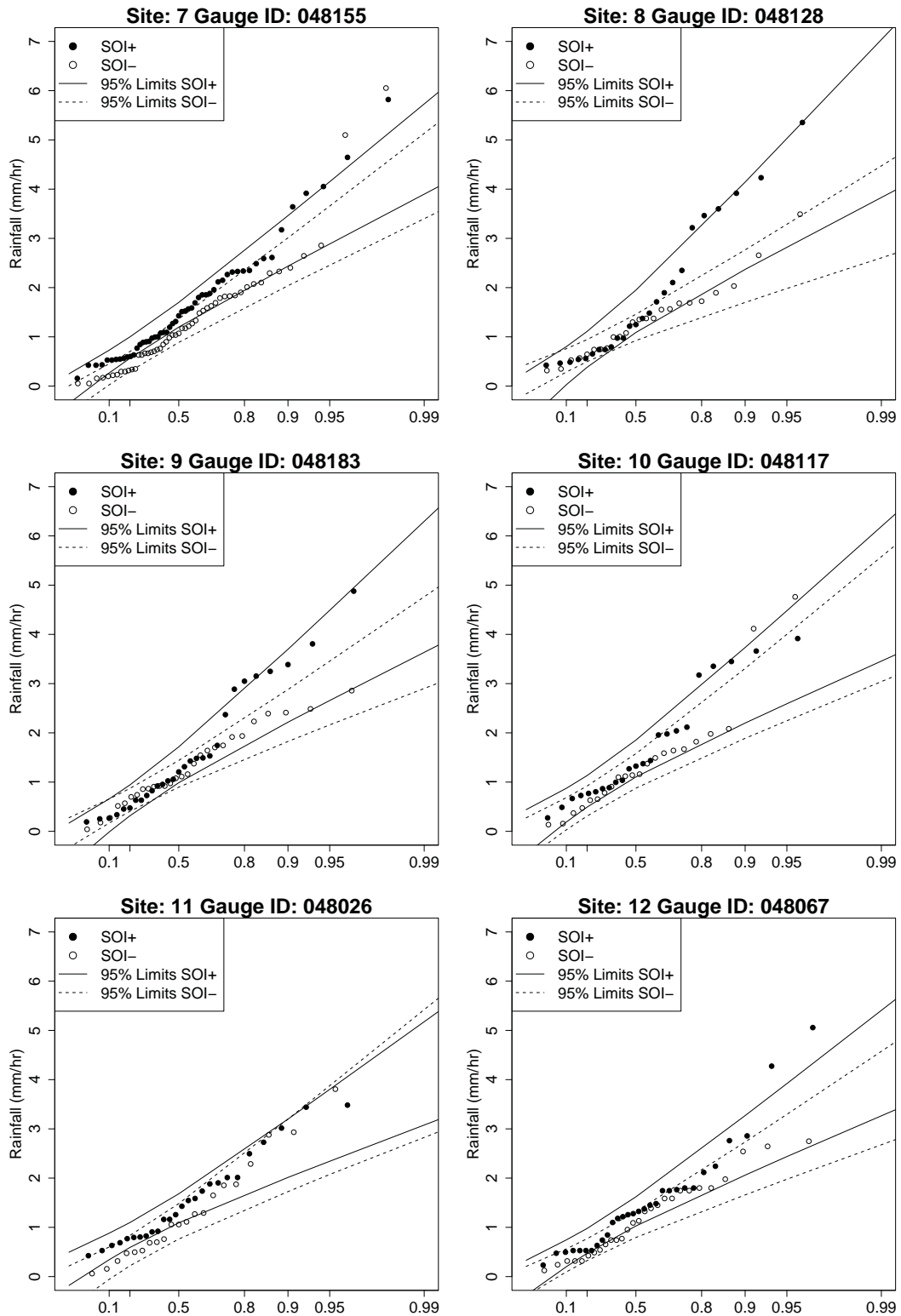


Figure B.5 Summer extremes of daily rainfall at Bourke partitioned by +ve/-ve phases of the SOI. Probabilities shown using a Gumbel axis. 95% Confidence intervals obtained from the distribution of estimates of the Gumbel parameters. Sites 7-12.

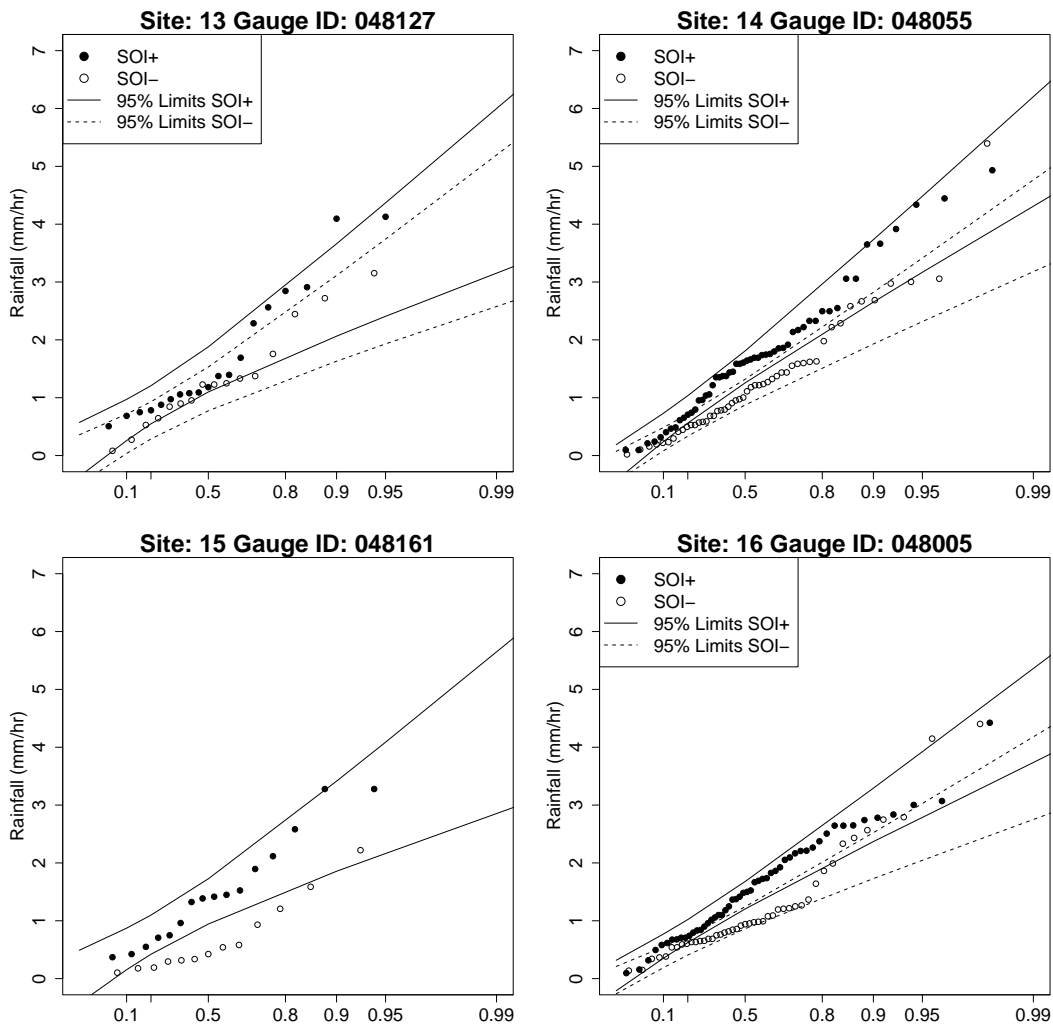


Figure B.6 Summer extremes of daily rainfall at Bourke partitioned by +ve/-ve phases of the SOI. Probabilities shown using a Gumbel axis. 95% Confidence intervals obtained from the distribution of estimates of the Gumbel parameters. Sites 13-16.

B.3 OBSERVED SOI PARTITIONED WINTER EXTREMES

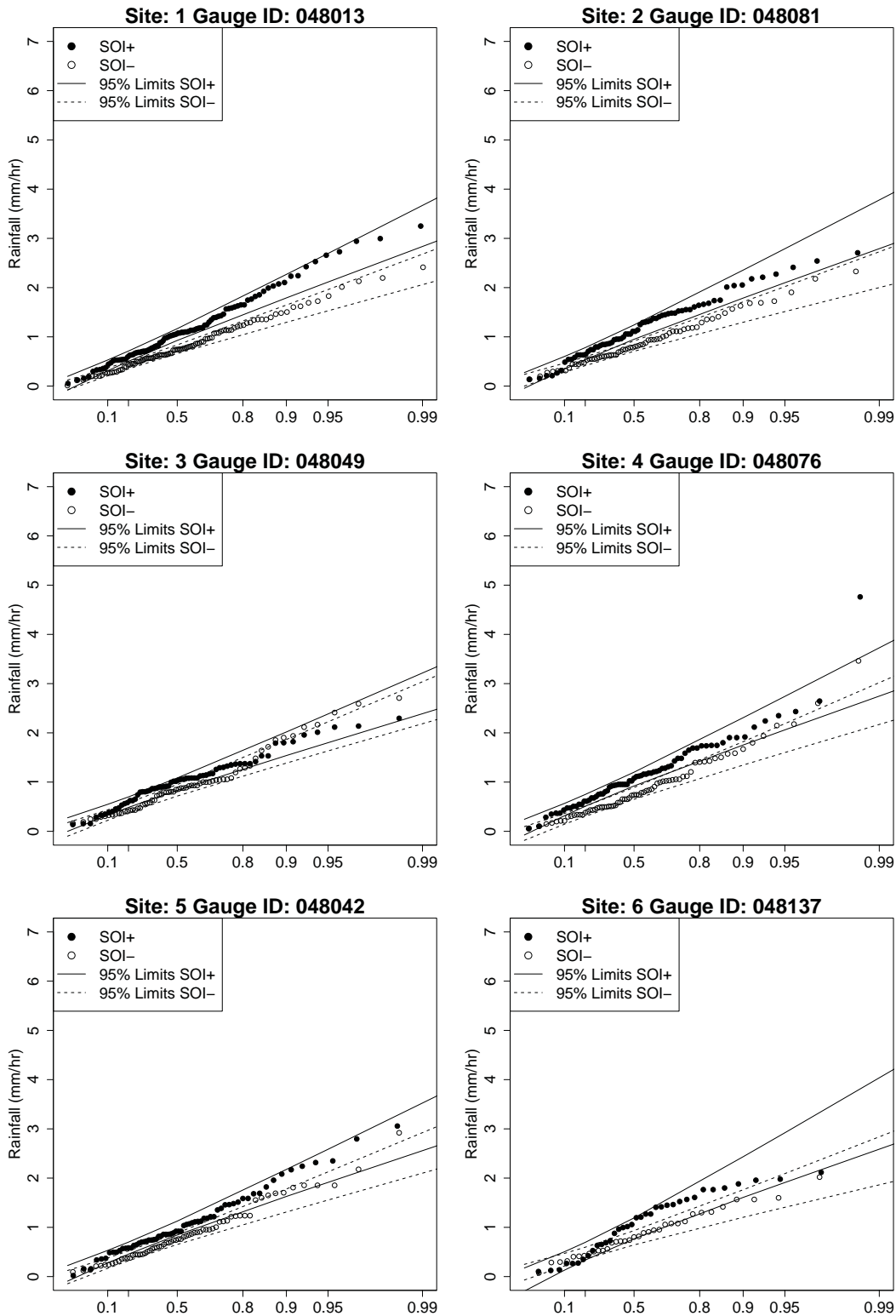


Figure B.7 Winter extremes of daily rainfall at Bourke partitioned by +ve/-ve phases of the SOI. Probabilities shown using a Gumbel axis. 95% Confidence intervals obtained from the distribution of estimates of the Gumbel parameters. Sites 1-6.

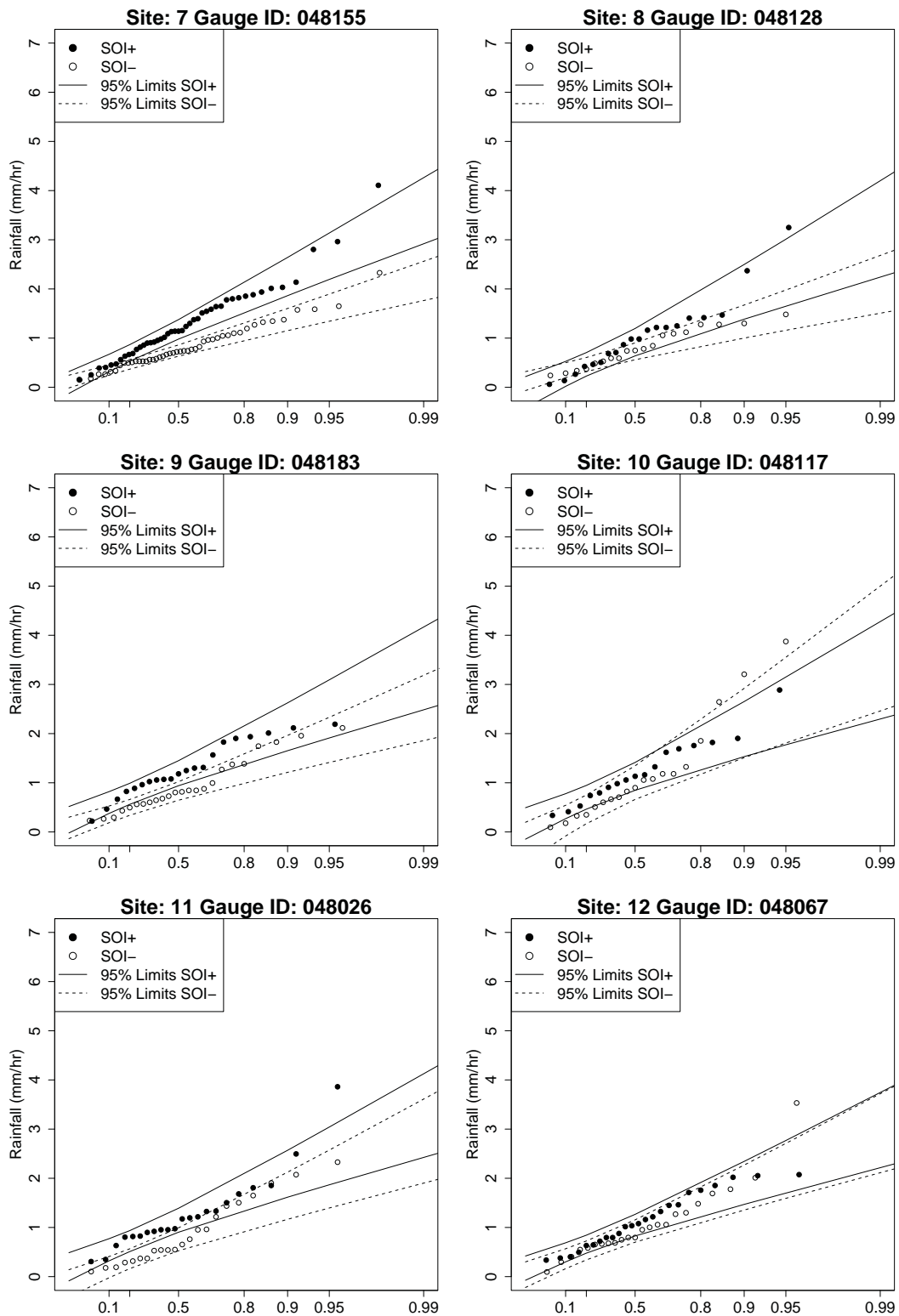


Figure B.8 Winter extremes of daily rainfall at Bourke partitioned by +ve/-ve phases of the SOI. Probabilities shown using a Gumbel axis. 95% Confidence intervals obtained from the distribution of estimates of the Gumbel parameters. Sites 7-12.

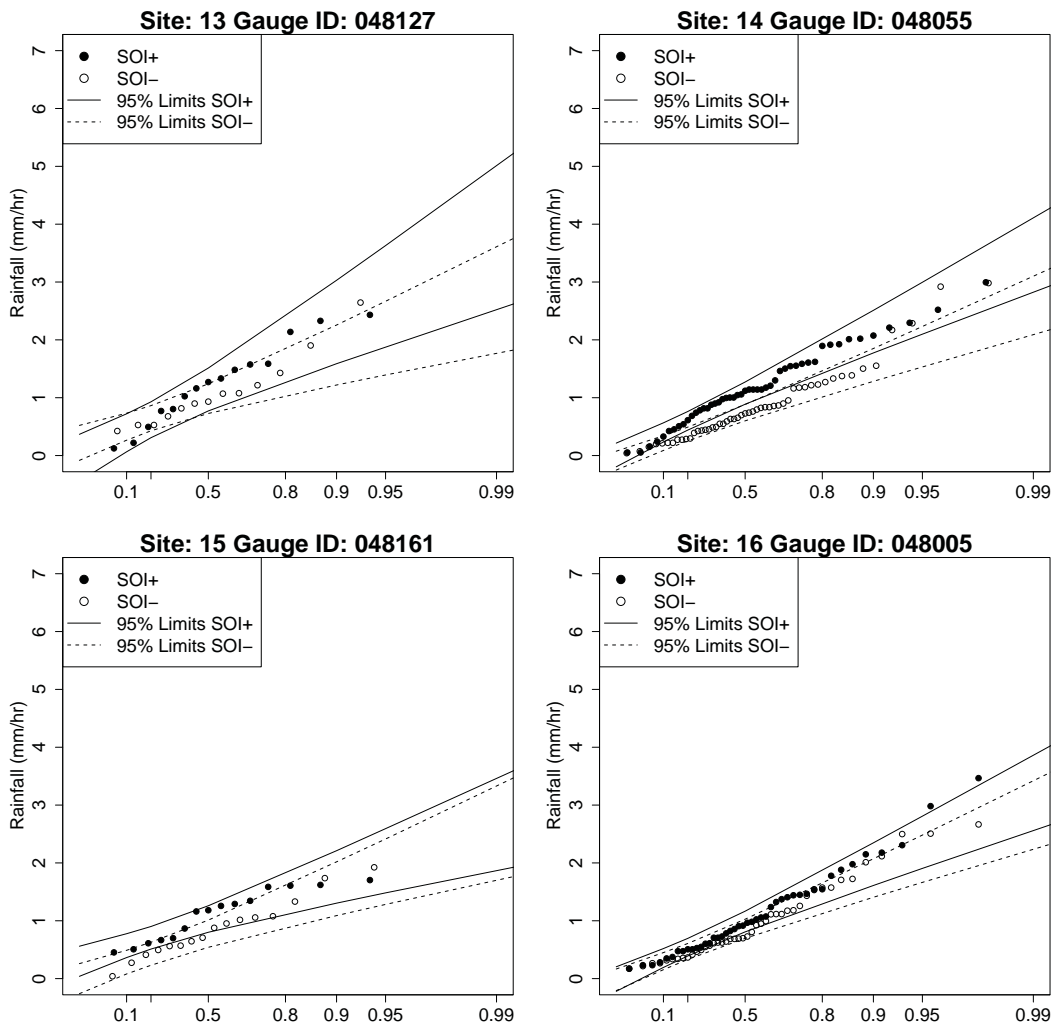


Figure B.9 Winter extremes of daily rainfall at Bourke partitioned by +ve/-ve phases of the SOI. Probabilities shown using a Gumbel axis. 95% Confidence intervals obtained from the distribution of estimates of the Gumbel parameters. Sites 13-16.

B.4 OBSERVED SEASONALLY PARTITIONED SOI+ EXTREMES

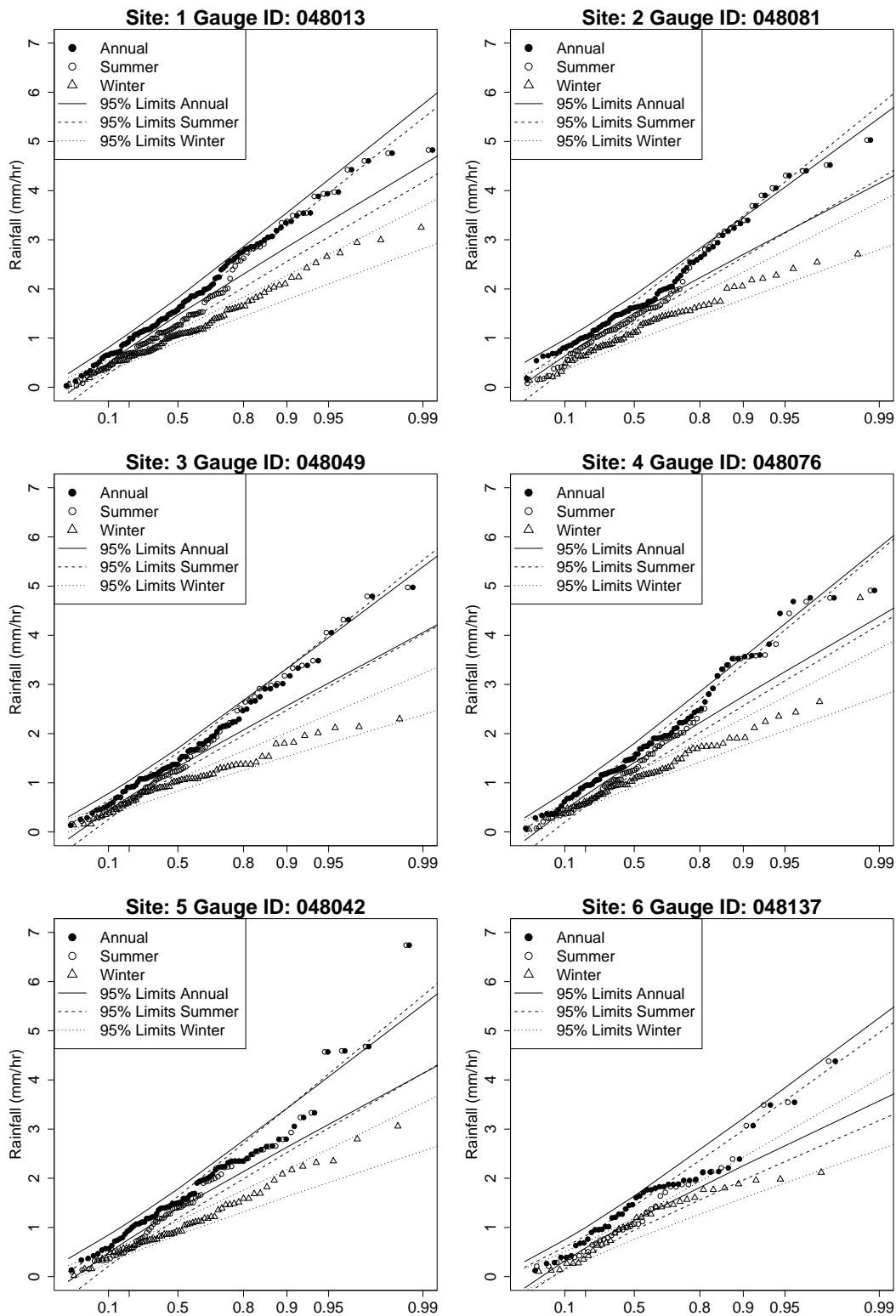


Figure B.10 Annual and 6-month seasonal extremes of daily rainfall at Bourke for +ve phase of the SOI. Probabilities shown using a Gumbel axis. 95% Confidence intervals obtained from the distribution of estimates of the Gumbel parameters. Sites 1-6.

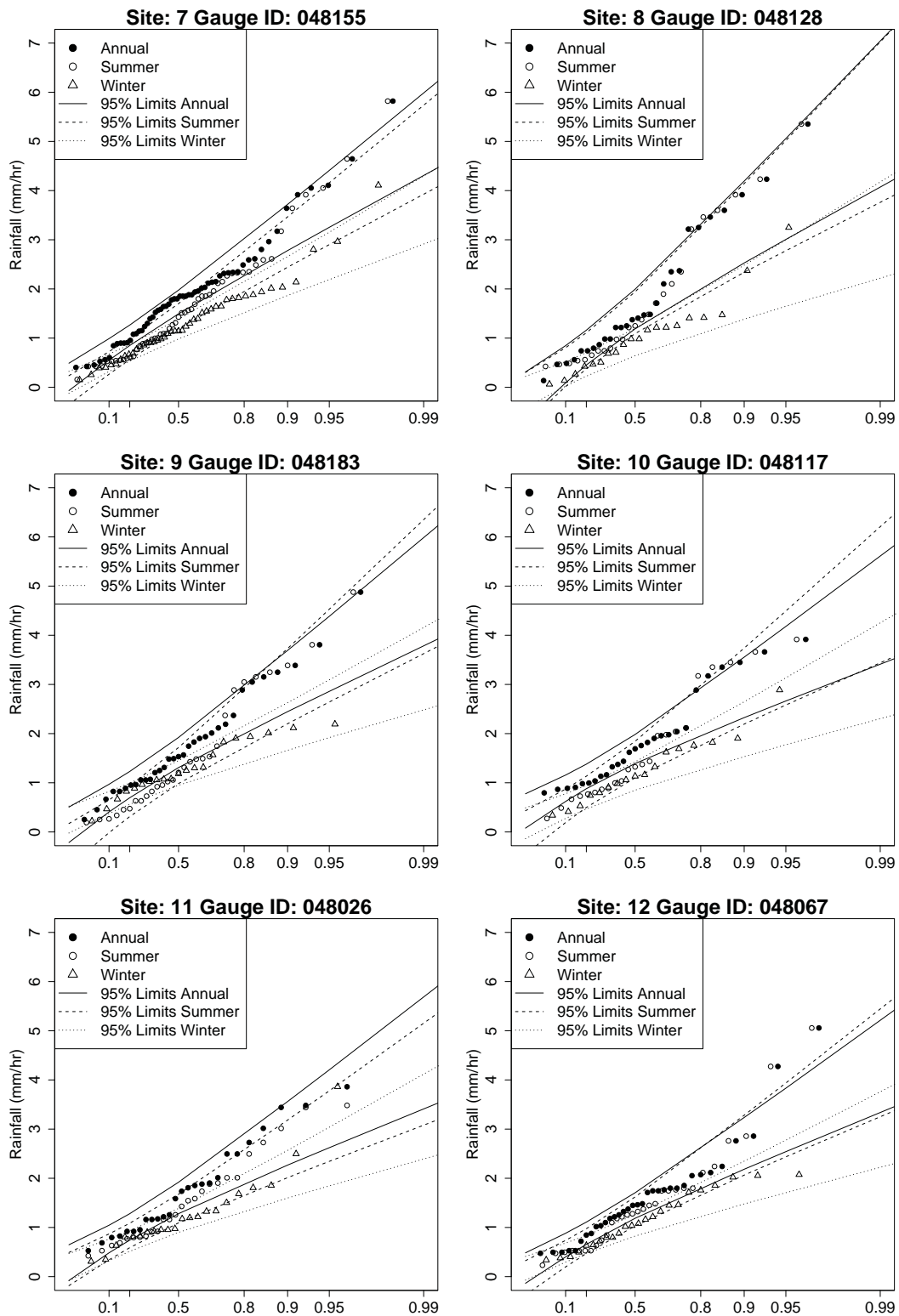


Figure B.11 Annual and 6-month seasonal extremes of daily rainfall at Bourke for +ve phase of the SOI. Probabilities shown using a Gumbel axis. 95% Confidence intervals obtained from the distribution of estimates of the Gumbel parameters. Sites 7-12.

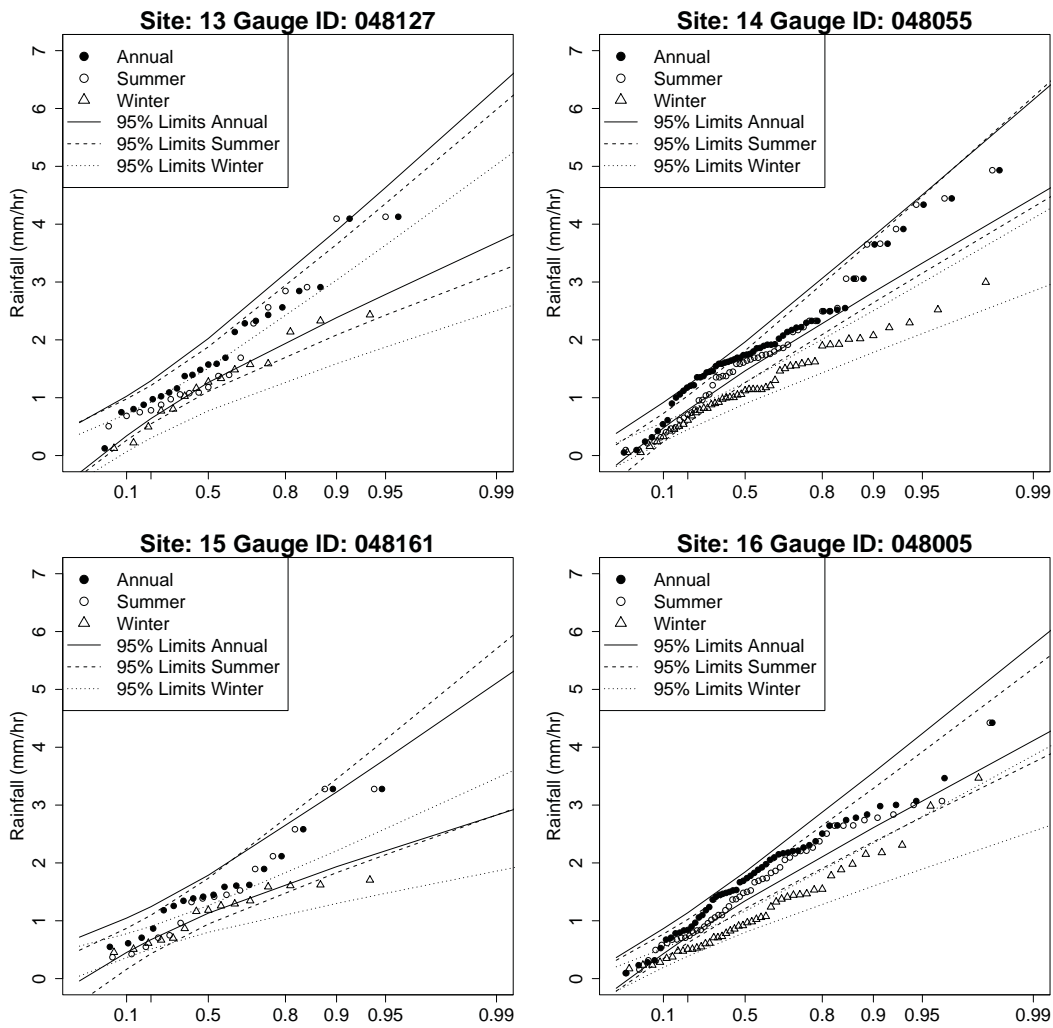


Figure B.12 Annual and 6-month seasonal extremes of daily rainfall at Bourke for +ve phase of the SOI. Probabilities shown using a Gumbel axis. 95% Confidence intervals obtained from the distribution of estimates of the Gumbel parameters. Sites 13-16.

B.5 OBSERVED SEASONALLY PARTITIONED SOI- EXTREMES

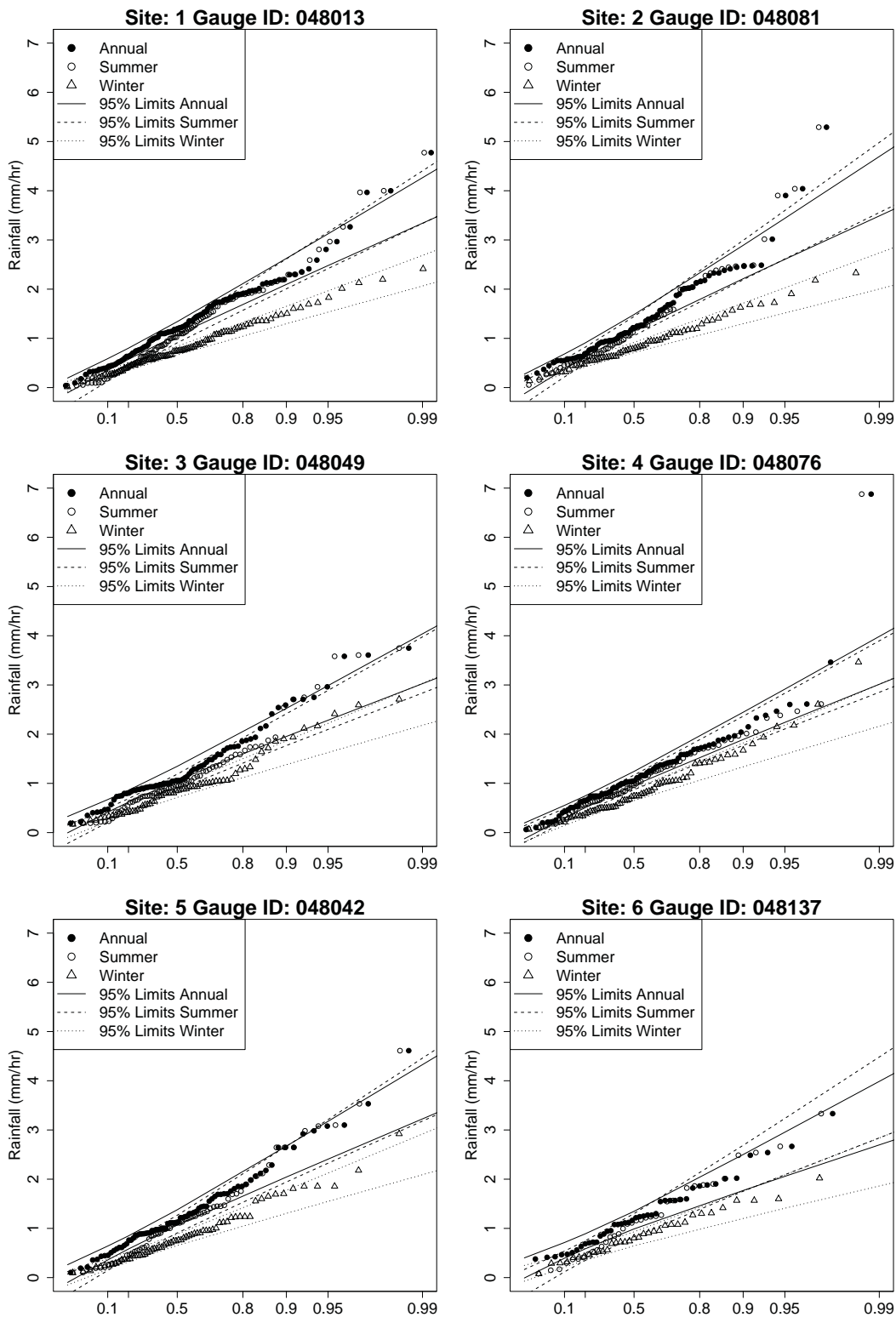


Figure B.13 Annual and 6-month seasonal extremes of daily rainfall at Bourke for -ve phase of the SOI. Probabilities shown using a Gumbel axis. 95% Confidence intervals obtained from the distribution of estimates of the Gumbel parameters. Sites 1-6.

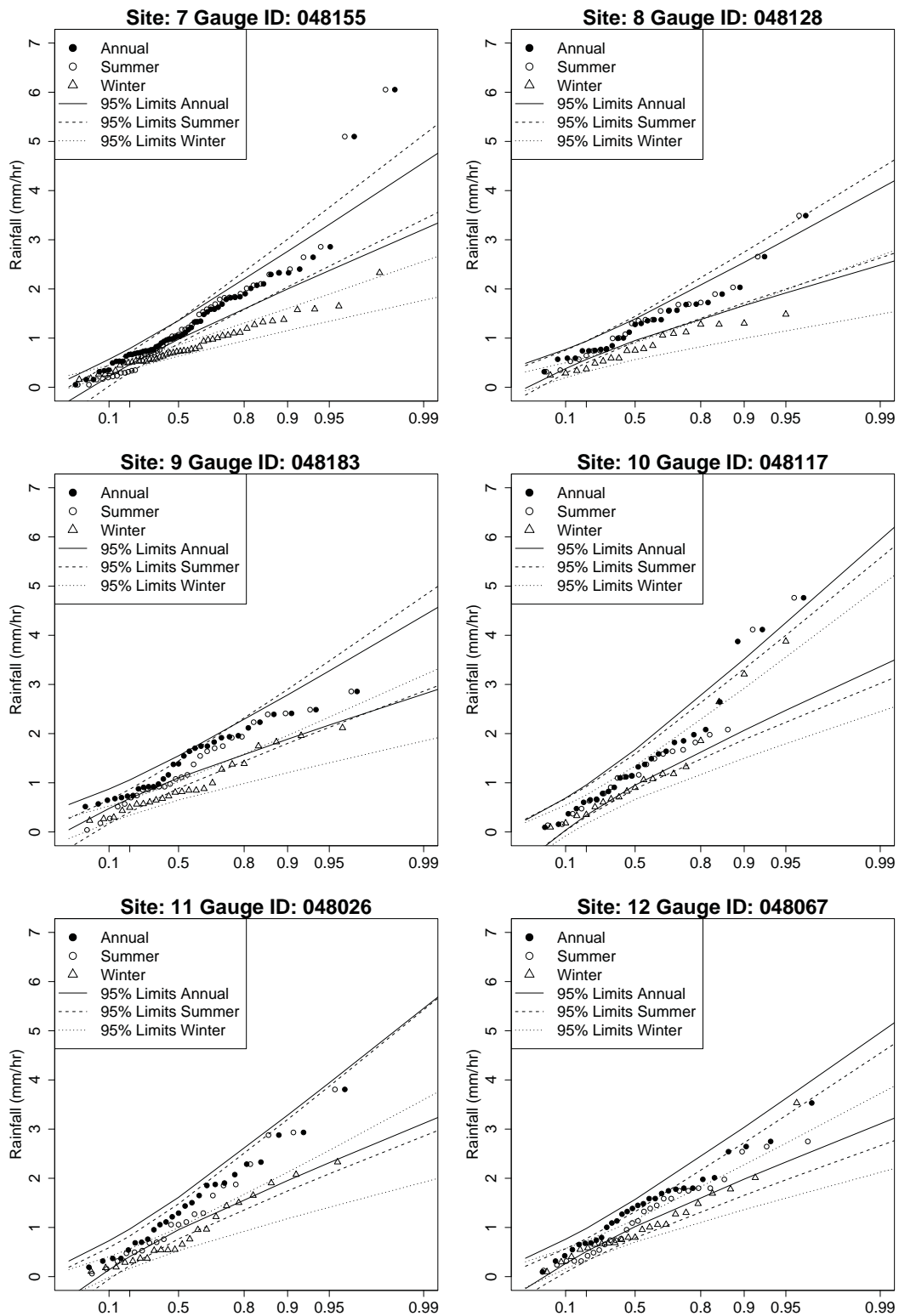


Figure B.14 Annual and 6-month seasonal extremes of daily rainfall at Bourke for -ve phase of the SOI. Probabilities shown using a Gumbel axis. 95% Confidence intervals obtained from the distribution of estimates of the Gumbel parameters. Sites 7-12.

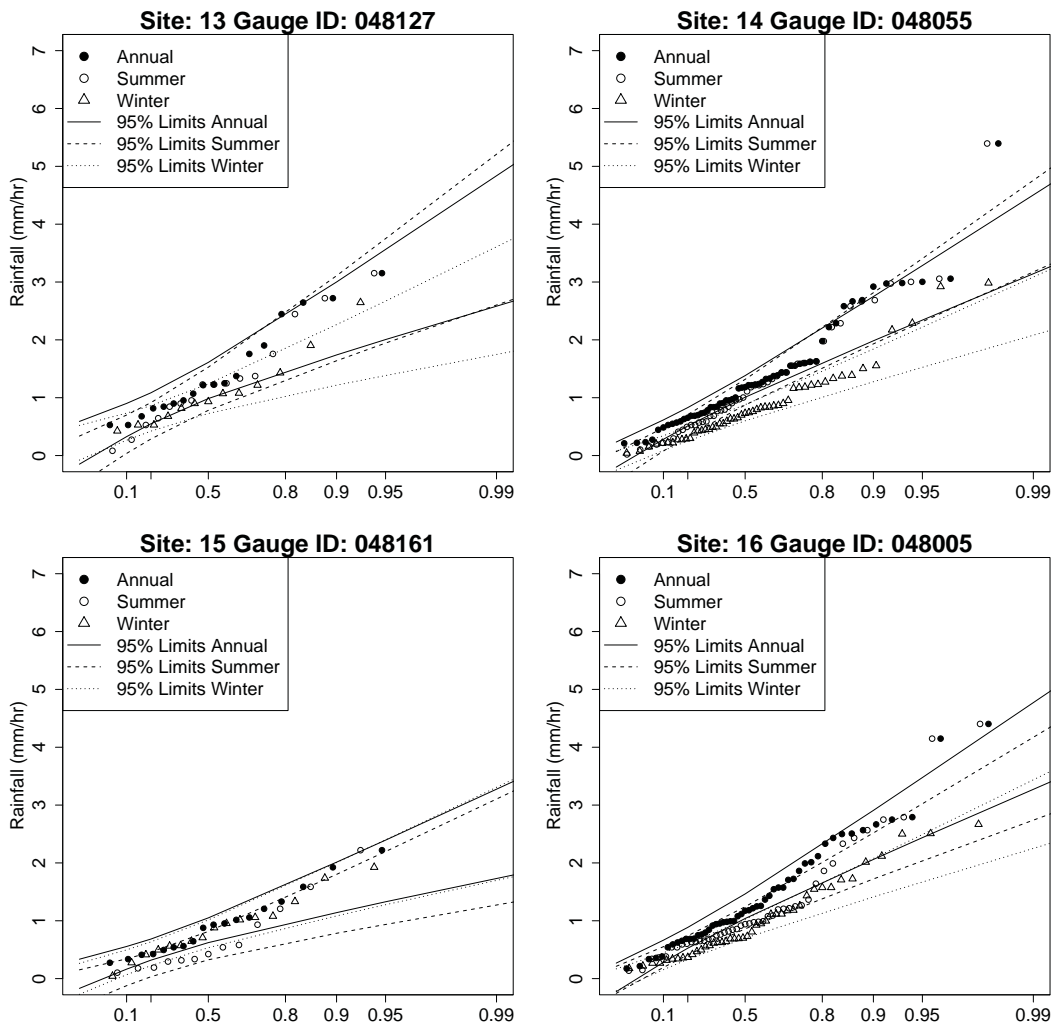


Figure B.15 Annual and 6-month seasonal extremes of daily rainfall at Bourke for -ve phase of the SOI. Probabilities shown using a Gumbel axis. 95% Confidence intervals obtained from the distribution of estimates of the Gumbel parameters. Sites 13-16.

B.6 COMPARISON OF OBSERVED AND SIMULATED EXTREMES

The figures in this section compare extreme values irrespective of the phase of the SOI. Separate comparisons for SOI partitioned extremes have been omitted, but show a similar quality of fit.

The simulated confidence limits are from 1000 replicated series each having 100 years of 24 hour data. Note that the number of observed extremes is not in the vicinity of 100 at some of the sites, so the observed sampling variability will differ from the simulated sampling variability.

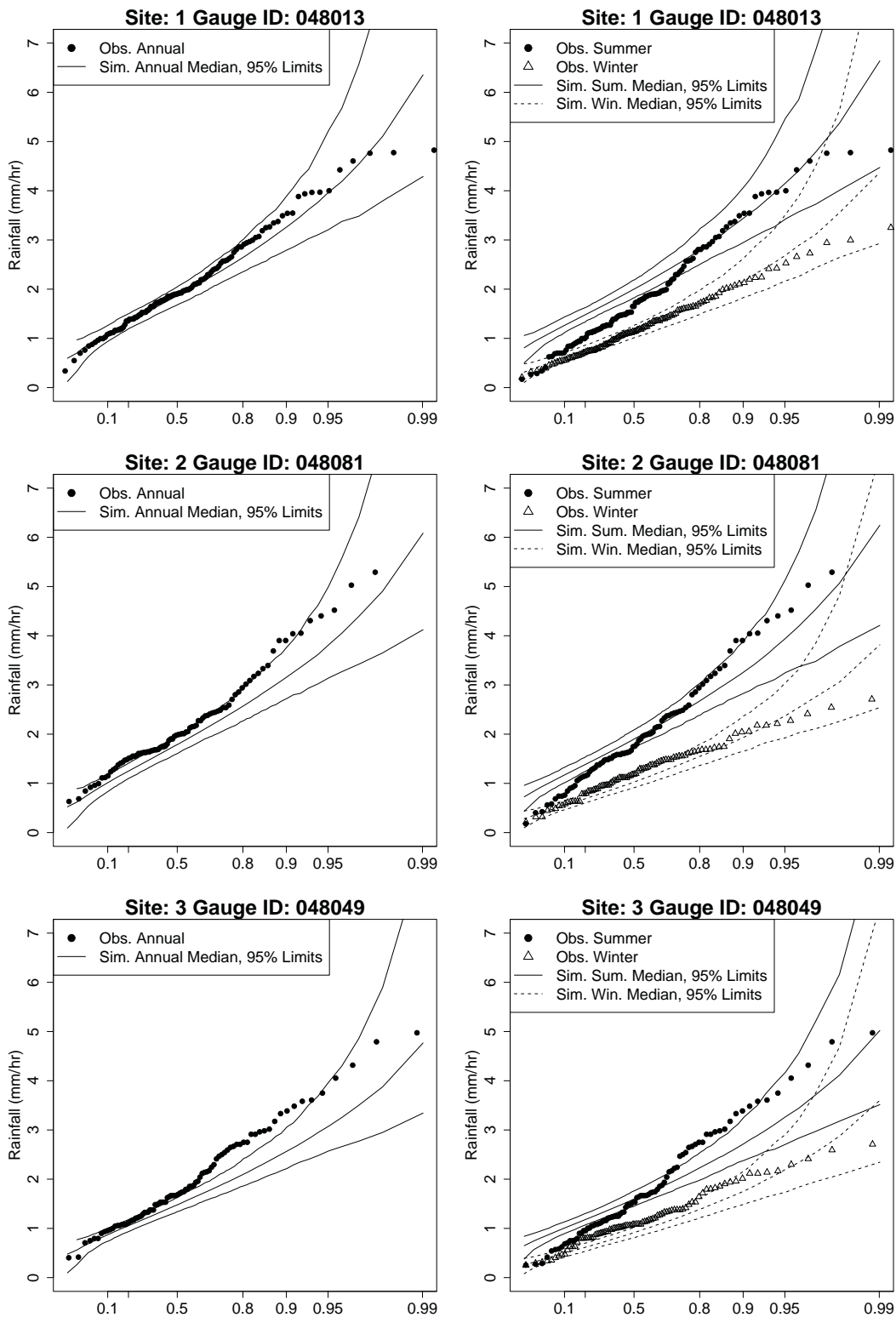


Figure B.16 L.H.S. compares observed annual extremes with the median and 95% limits of extremes from simulated daily records. R.H.S. figures compare observed 6-month seasonal extremes with simulated confidence limits. Simulated values from 1000 replicates of 100-year records. Probabilities shown using a Gumbel axis. Sites 1-3.

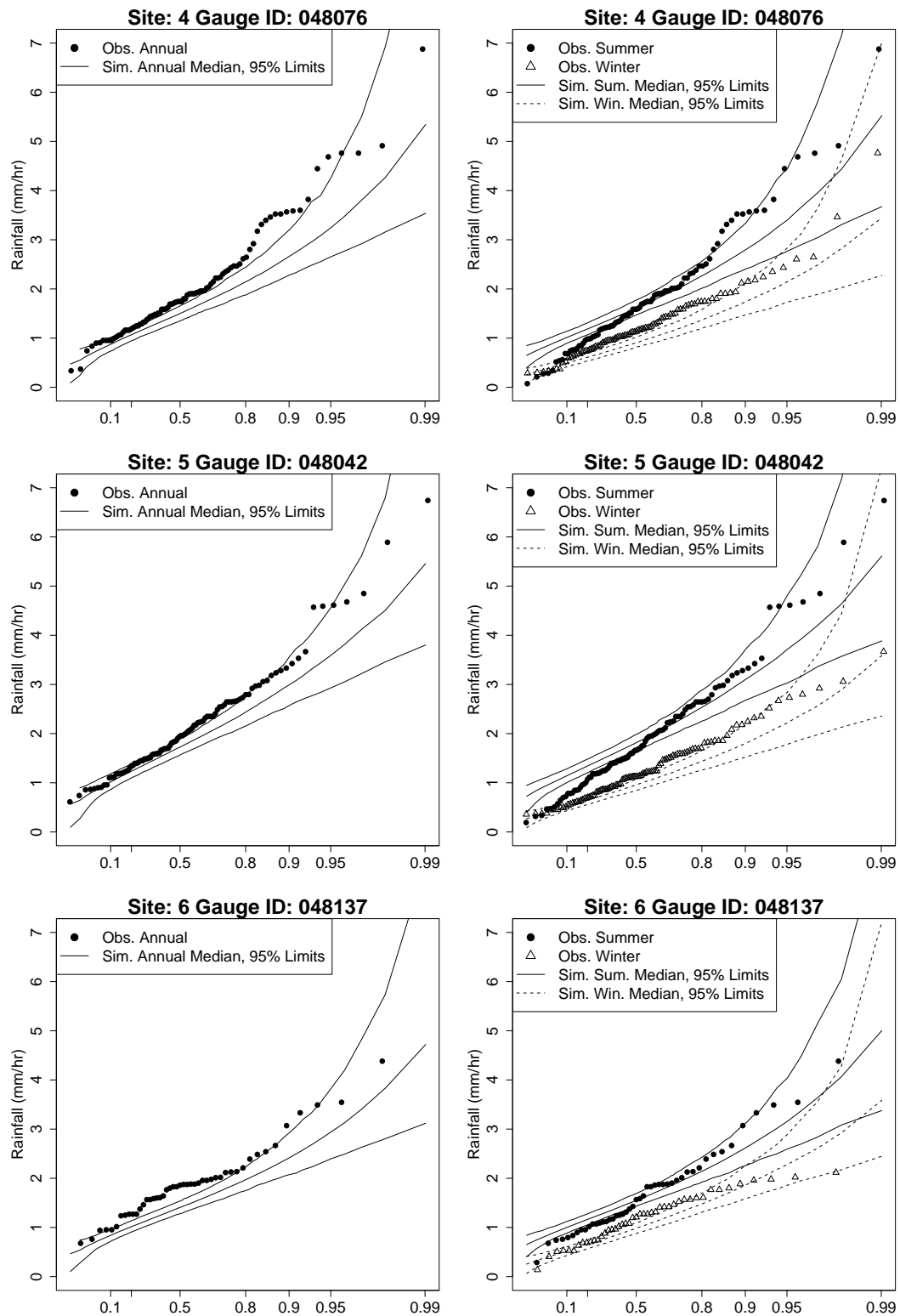


Figure B.17 L.H.S. compares observed annual extremes with the median and 95% limits of extremes from simulated daily records. R.H.S. figures compare observed 6-month seasonal extremes with simulated confidence limits. Simulated values from 1000 replicates of 100-year records. Probabilities shown using a Gumbel axis. Sites 4-6.

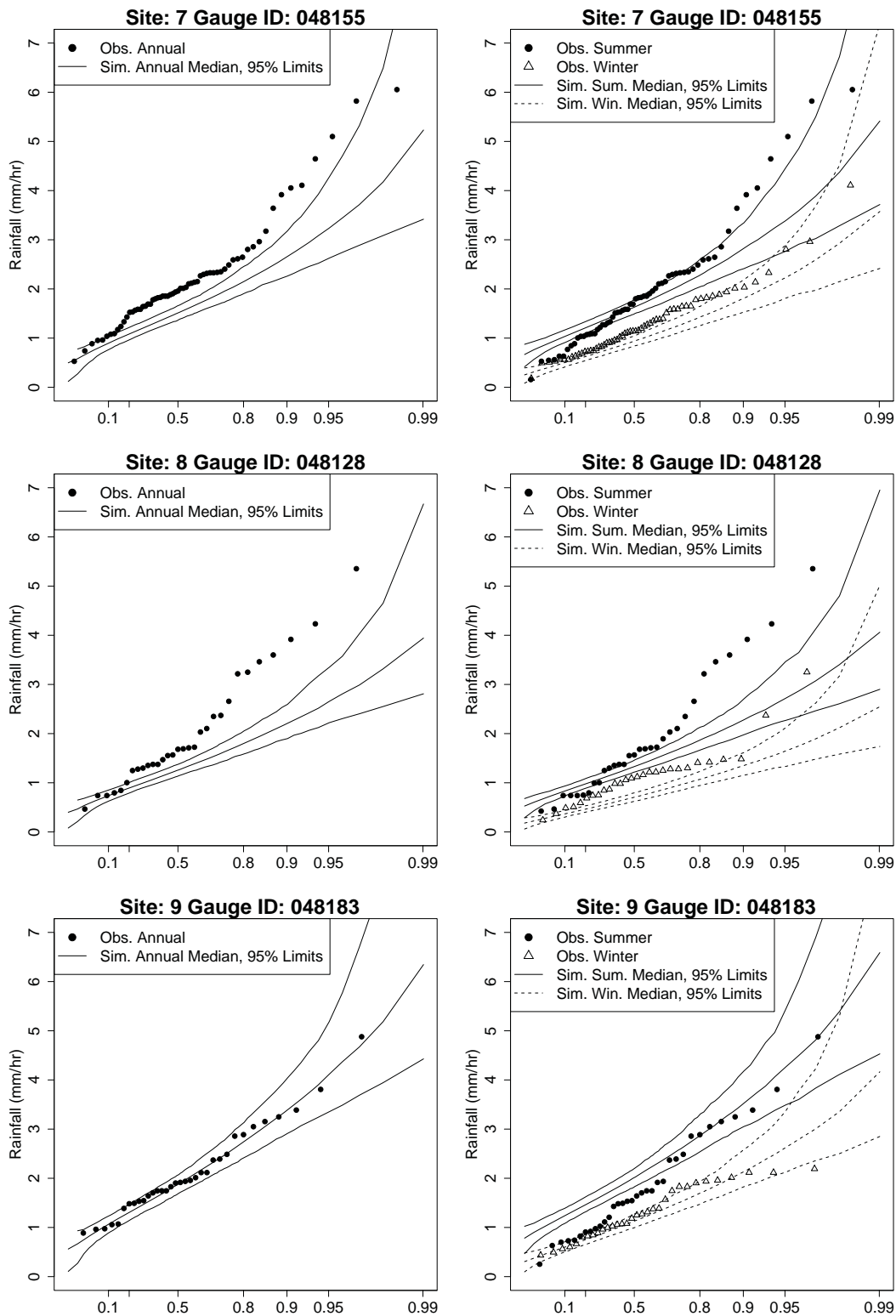


Figure B.18 L.H.S. compares observed annual extremes with the median and 95% limits of extremes from simulated daily records. R.H.S. figures compare observed 6-month seasonal extremes with simulated confidence limits. Simulated values from 1000 replicates of 100-year records. Probabilities shown using a Gumbel axis. Sites 7-9.

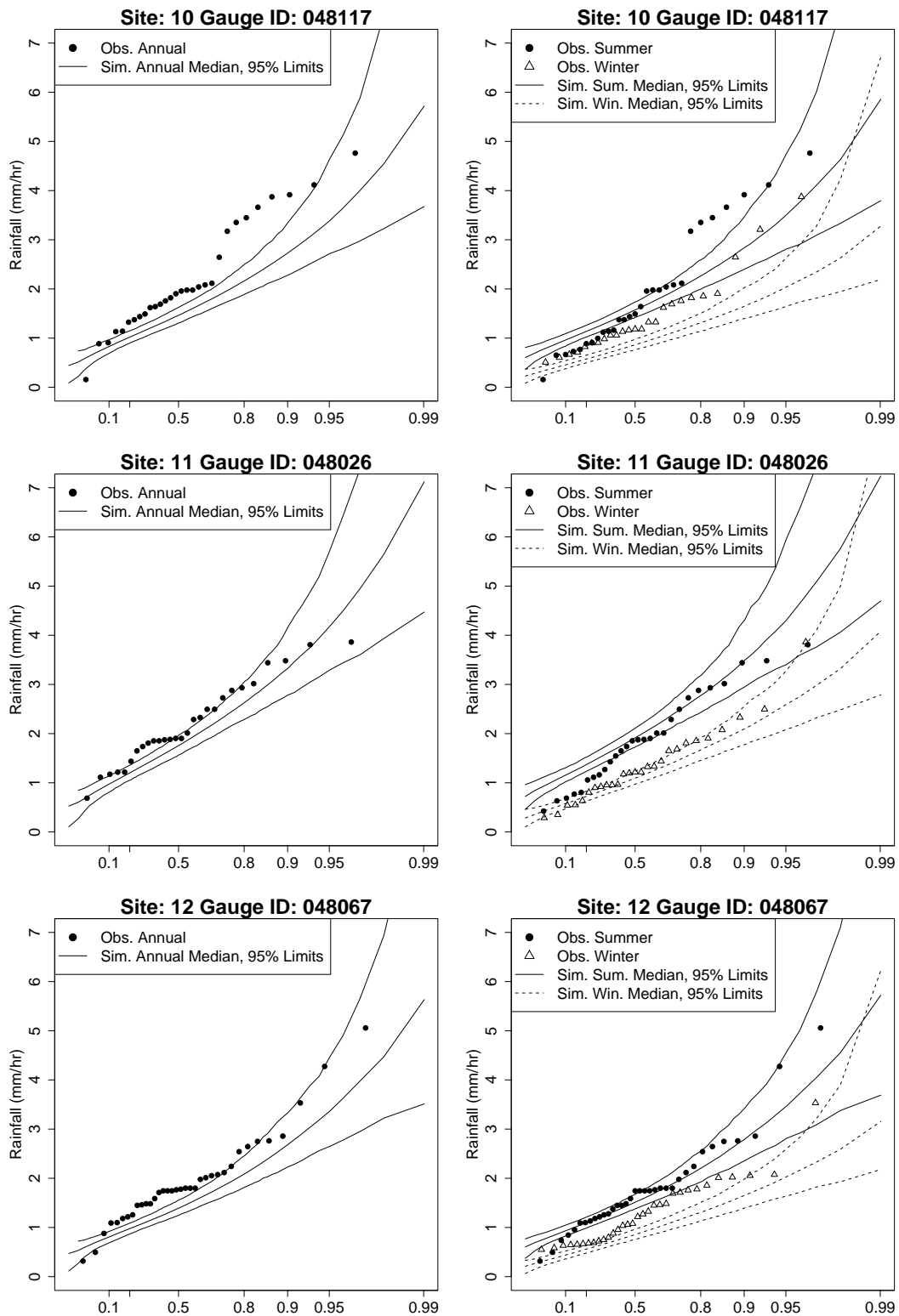


Figure B.19 L.H.S. compares observed annual extremes with the median and 95% limits of extremes from simulated daily records. R.H.S. figures compare observed 6-month seasonal extremes with simulated confidence limits. Simulated values from 1000 replicates of 100-year records. Probabilities shown using a Gumbel axis. Sites 10-12.

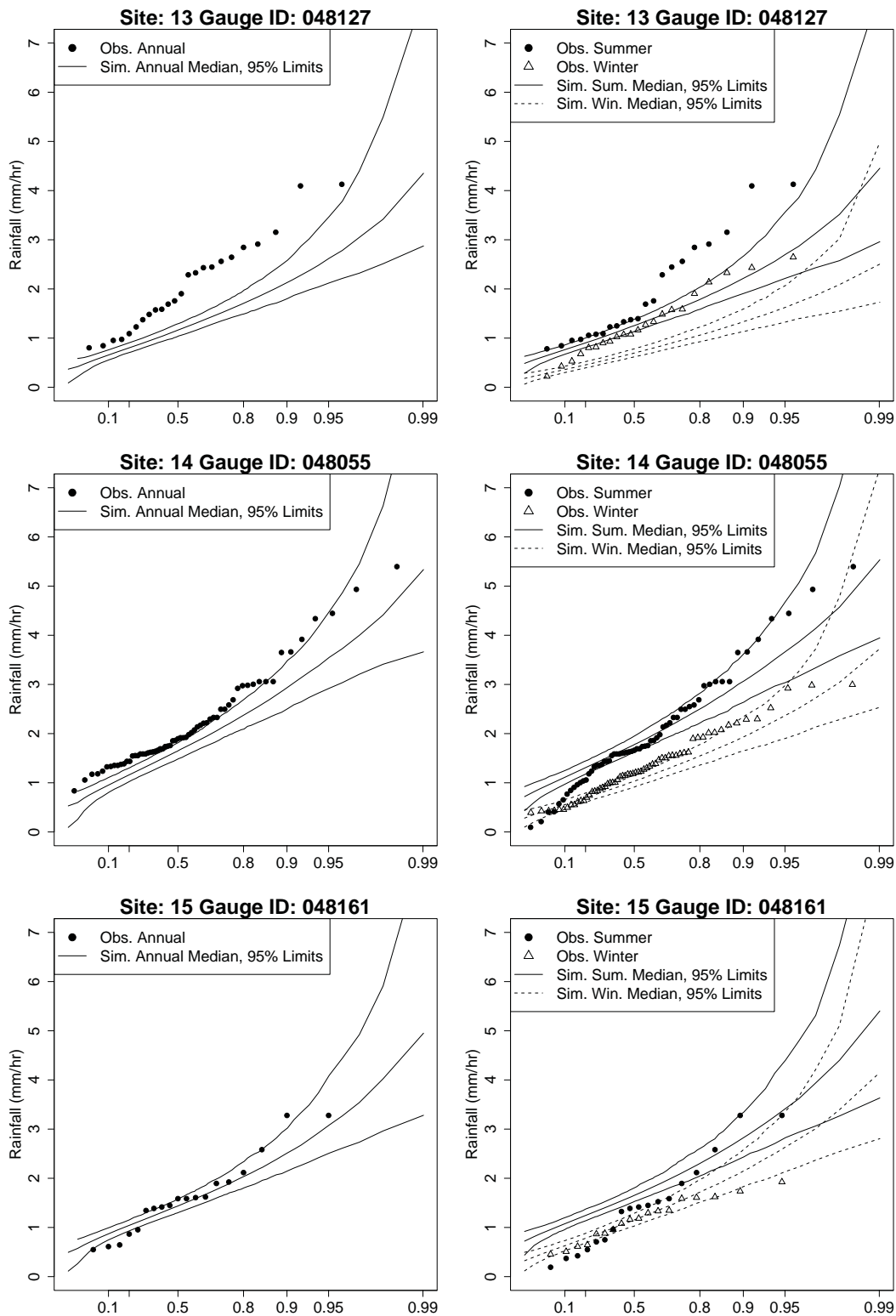


Figure B.20 L.H.S. compares observed annual extremes with the median and 95% limits of extremes from simulated daily records. R.H.S. figures compare observed 6-month seasonal extremes with simulated confidence limits. Simulated values from 1000 replicates of 100-year records. Probabilities shown using a Gumbel axis. Sites 13-15.

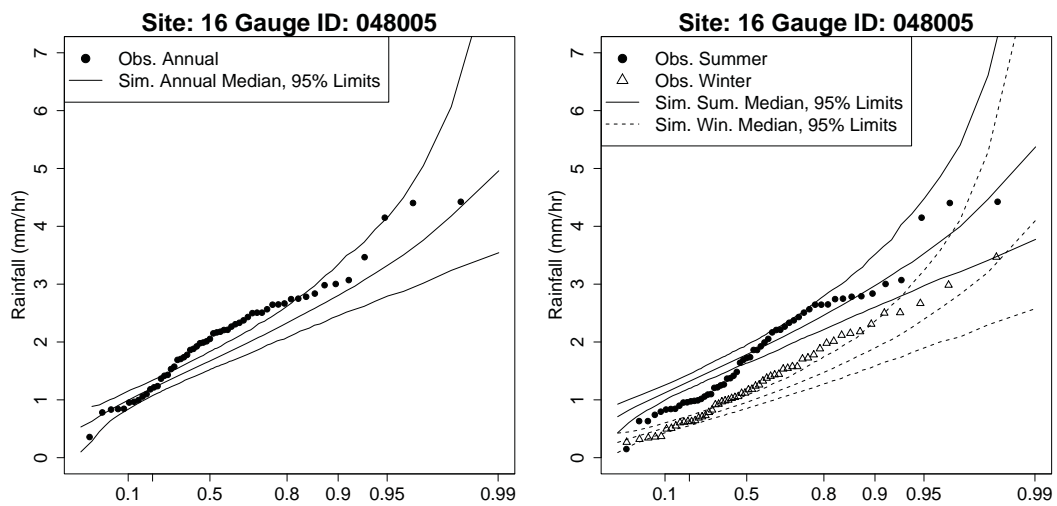


Figure B.21 L.H.S. compares observed annual extremes with the median and 95% limits of extremes from simulated daily records. R.H.S. figures compare observed 6-month seasonal extremes with simulated confidence limits. Simulated values from 1000 replicates of 100-year records. Probabilities shown using a Gumbel axis. Site 16.