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Rainfall Analysis for the Late April into Early May 2017 Flood Event in Southern Missouri and Northern Arkansas

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33 **ABSTRACT**

34 In late April 2017, a slow moving frontal system in the central U.S. was the focusing
35 mechanism for widespread heavy showers and thunderstorms. Multiple waves of rainfall
36 impacted portions of northeast Oklahoma, northern Arkansas, southern Missouri, and southern
37 Illinois from 28 April 2017 to 1 May 2017. Traditional National Weather Service (NWS) rainfall
38 estimation techniques use daily and multi-day rainfall reports only indirectly due to rainfall being
39 analyzed on an hourly basis. Analyzing the event on a daily basis would allow for better usage of
40 hourly, daily, and multi-day rainfall reports and increase the precision of subsequent storm total
41 rainfall estimates.

42 This report presents an analysis of rainfall reports from the impacted areas and
43 categorizes the rainfall rarity in terms of the area's rainfall climatology. NWS hydrologists
44 collected additional reports of rainfall from private weather stations and social media. Radar-
45 derived estimates of rainfall were bias corrected using techniques currently in use by NWS River
46 Forecast Centers (RFCs), but adjusted slightly to use the kriging interpolation technique. A
47 secondary interpolation using co-kriging with radar beam elevation height was also performed.
48 Bias-corrected rainfall estimates were then analyzed to determine annual exceedance probability
49 (AEP) values for each location. The area of heaviest storm total rainfall exceeded the 1-in-1000
50 annual chance event and multiple counties experienced rainfall greater than the 1-in-100 annual
51 chance. The secondary interpolation technique utilizing co-kriging caused mostly minor changes
52 to the rainfall analysis but did increase rainfall estimates in the hardest-hit areas due to the
53 significant distance from radar sites.

54 **1.0 Introduction**

55 A slow-moving weather system produced heavy rainfall across portions of the central
56 U.S. including parts of Missouri and Arkansas from April 29, 2017, through May 1, 2017. On the
57 afternoon of April 28th, 2017, a stationary front that extended from southeast Missouri across
58 west central Arkansas began moving slowly northward as a warm front. An upper level storm
59 system moved east from the Rocky Mountains bringing moisture from the Gulf of Mexico
60 northward. By April 29th, the warm front had moved into southern Missouri and became the
61 focusing mechanism for multiple waves of slow-moving thunderstorms. Very high amounts of
62 atmospheric moisture were available for these thunderstorms with precipitable water values
63 observed at the National Weather Service (NWS) office in Springfield, Missouri above daily
64 record values (Figure 1). Finally by May 1st a cold front moved east across the area bringing an
65 end to the rainfall.

66 The heaviest rainfall occurred over an approximately 48-h period ending the morning
67 of April 30. Storm total rainfall amounts of 3-6 inches were widespread across southern Missouri
68 with isolated areas receiving more than 10 inches. For portions of northern and northeastern
69 Arkansas, amounts of 2-3 inches were widespread with isolated amounts up to 9 inches. For the
70 hardest hit areas, preliminary estimates suggested that rainfall of this magnitude was rare -
71 having a less than 1% chance of occurring in a given year (also known as annual exceedance
72 probability, or AEP). This rainfall led to widespread flooding across multiple NWS river forecast
73 center (RFC) forecast areas. Although the most widespread flooding occurred within the area
74 served by the Lower Mississippi River Forecast Center (LMRFC), record flooding was also
75 observed in areas served by the Arkansas-Red Basin River Forecast Center (ABRFC), Missouri

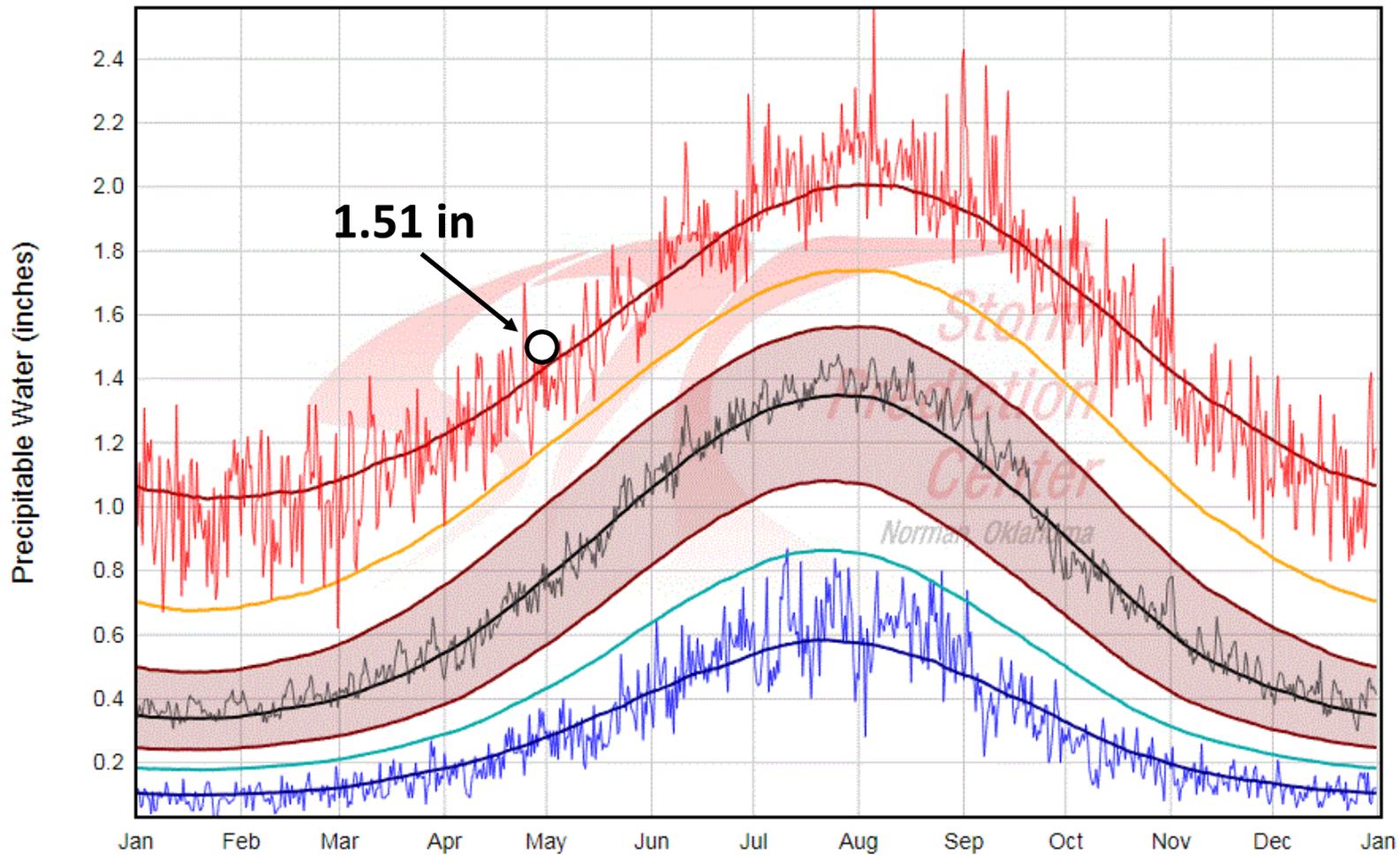
76 Basin River Forecast Center (MBRFC), North Central River Forecast Center (NCRFC), and the
77 Ohio River Forecast Center (OHRFC).

78 Over the following days, numerous river locations downstream of the heavy rainfall
79 experienced flash flooding and river flooding. Flash flooding in some areas was particularly
80 severe. Post-event flood surveys indicated that multiple bridges and structures were not only
81 flooded but were completely destroyed. Additionally, several stream gauges were damaged with
82 a few swept away. Numerous people were rescued from flooded areas (NWS Springfield, 2017).
83 In the LMRFC area, preliminary stream gauge observations indicate that over 20 locations set
84 new stage records (Figure 2). When adding in locations from neighboring RFCs, this number
85 climbs to at least 30, with almost half of these locations having a period of record longer than 50
86 years. The extreme nature of this event necessitates the collection of as much data as possible to
87 establish an accurate historical context of rainfall severity.

88 In Lincoln et al (2017), it was suggested that an increased density of rainfall
89 observations and reports of flooding could improve the estimation of event magnitude (including
90 rainfall AEP). For the event studied in Lincoln et al, the addition of rainfall reports obtained
91 through crowd-sourcing (public reports, posts to social media, private data collection networks)
92 decreased rainfall totals in some areas and increased rainfall totals in other areas, although the
93 hardest-hit areas generally were increased.

94 The purpose of this report is to re-evaluate the rainfall estimates for the late April/early
95 May rainfall event using additional data obtained by following the methodology of Lincoln et al
96 (2017). The collection of additional point rainfall data will be discussed along with the updating
97 of gridded rainfall estimates based upon this data. Multiple rainfall interpolation techniques will
98 be presented and discussed.

ALL Soundings for SGF



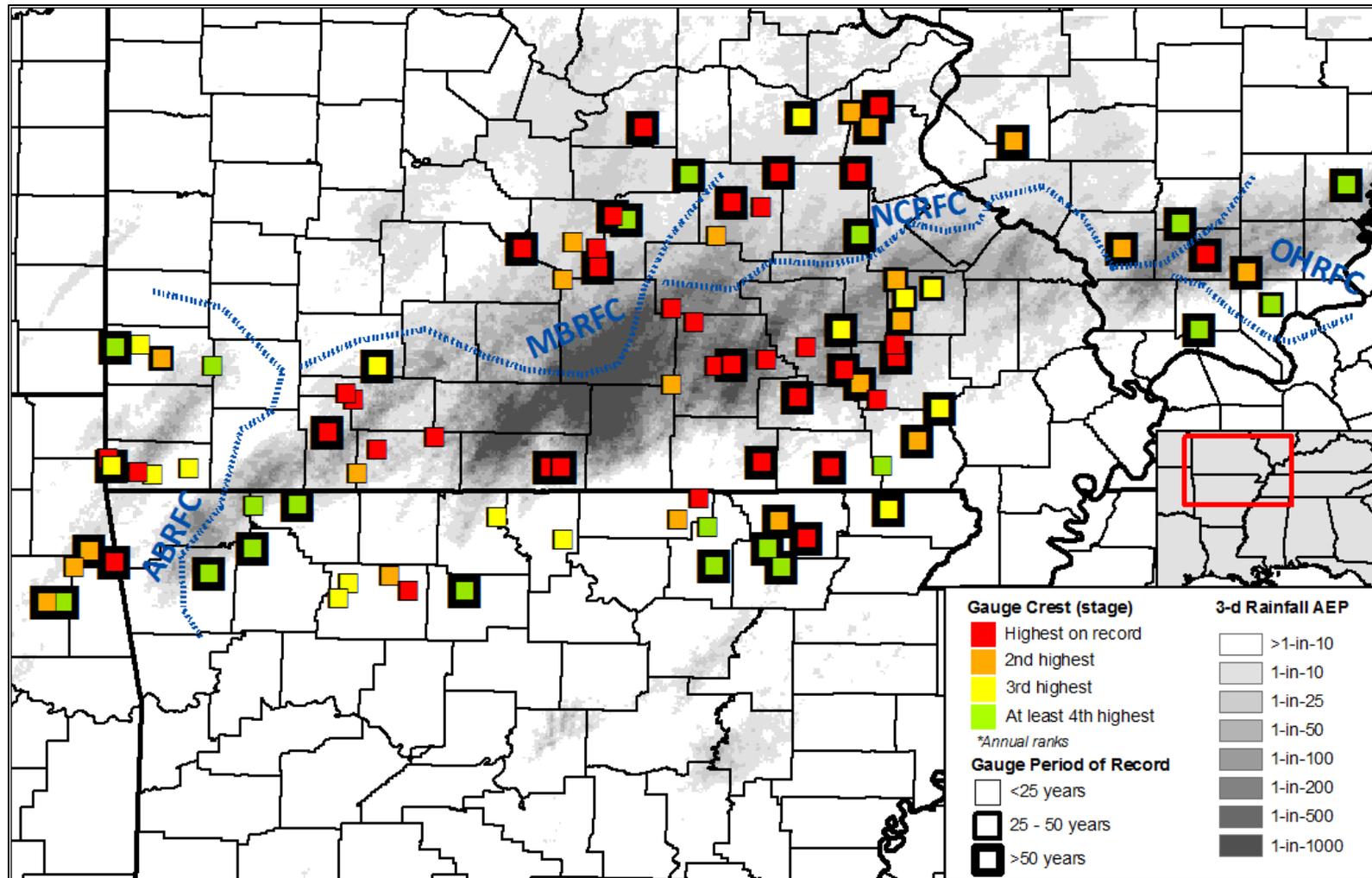
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Figure 1. Precipitable water climatology values from soundings at NWS WFO Springfield, Missouri. Observed precipitable water value for 1200 UTC 29 April 2017 is indicated by the white circle; values remained at approximately this level through 1200 UTC 30 April 2017. This precipitable water value was above the daily record for that time of year and was among the highest ever recorded for the month of April at Springfield.

5 Rainfall Analysis for the Late April into Early May 2017 Flood Event in Southern Missouri and Northern Arkansas

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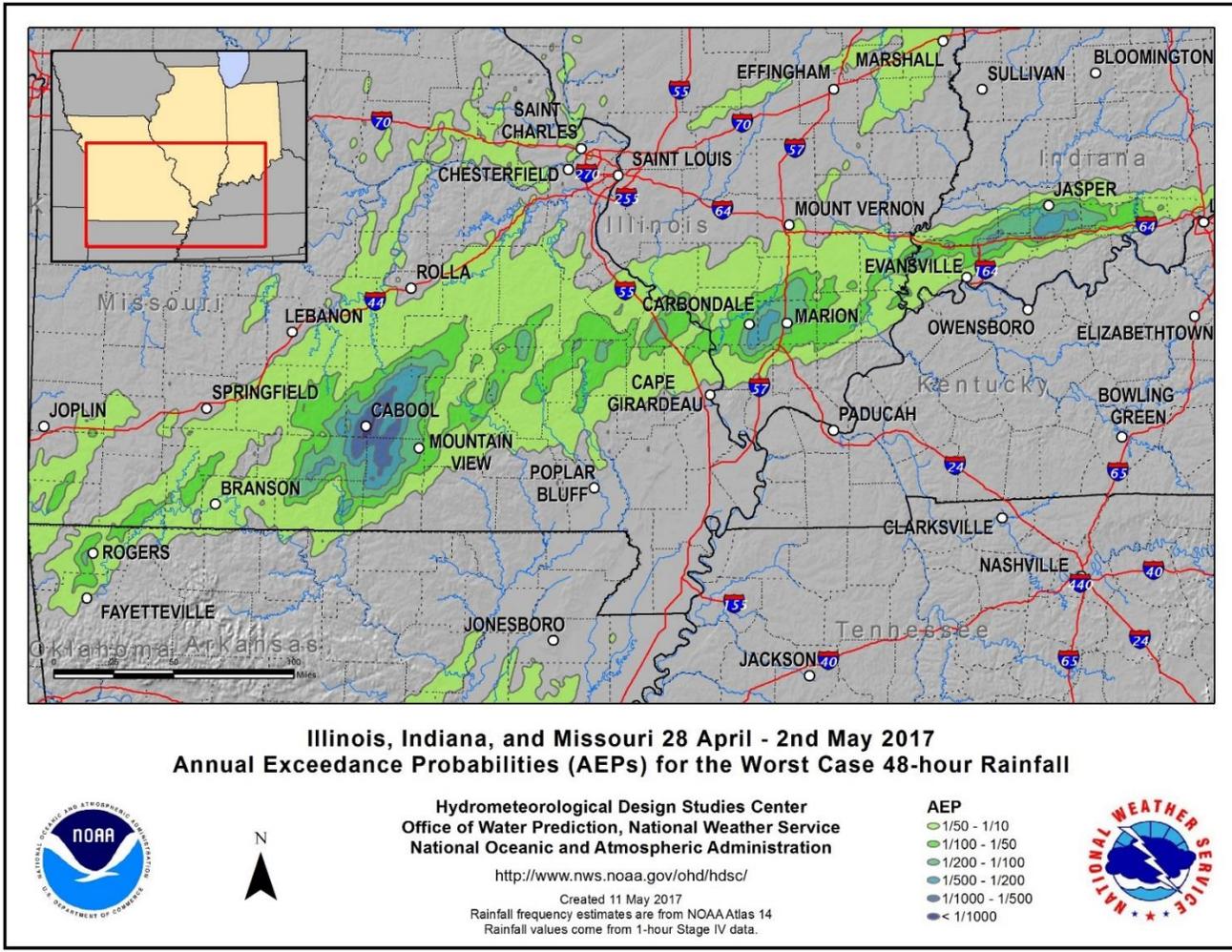
104 Figure 2. Stream gauge crests in southern Missouri, northern Arkansas, far northeast Oklahoma, and far southern Illinois from the late April into early May 2017 flood event.
105 Stream gauges which recorded a top 3 crest during the event are shaded yellow, orange, or red. Relative storm total rainfall (3-d ending 1200 UTC May 1) magnitude is indicated
106 by gray shading. Blue lines delineate the approximate boundaries of NWS RFC forecast areas. For areas outside of the LMRFC forecast area, stream gauge locations were added
107 for general information and may not be comprehensive. Crest ranking is based upon *annual* statistics. All crest data preliminary.

6 Rainfall Analysis for the Late April into Early May 2017 Flood Event in Southern Missouri and Northern Arkansas

108 *1.1. Discussion of previous rainfall analyses for this event*

109 The official gridded rainfall data of the NWS is produced hourly from remotely-sensed
110 radar estimates bias-corrected using point rain gauge observations. The base gridded radar
111 rainfall estimate used at the LMRFC comes from Multi-Radar Multi-Sensor (MRMS) data.
112 Hourly rain gauge data from multiple sources – the Automated Surface Observing Systems
113 (ASOS; automated stations located at airports), United States Geological Survey (USGS;
114 automated stations co-located with stream gauges), and the United States Forest Service (USFS;
115 automated stations) – are then compared to the base gridded radar rainfall estimate, MRMS, to
116 calculate a bias correction factor for each point. These bias correction factor values are then
117 interpolated to a grid via the inverse distance weighted method and multiplied by the raw rainfall
118 estimates to create the bias-corrected RFC best-estimate rainfall. Hydrometeorologists at the
119 RFCs can also make manual edits to the RFC best-estimate rainfall to further improve the data. It
120 is important to note that daily and multi-day rainfall reports are not automatically utilized by this
121 process to create the RFC best-estimate rainfall; RFC hydrometeorologists must make manual
122 edits to reconcile the hourly and daily data.

123 Based upon the RFC best-estimate rainfall data, a preliminary analysis of rainfall
124 severity was completed by the NWS Hydrologic Design Studies Center (HDSC). HDSC looked
125 at the maximum value from running 48-h rainfall accumulations between April 28th and May 2nd
126 (the so-called “worst case 48-h rainfall) to determine the severity of the rainfall event. Maximum
127 48-h rainfall totals across southern Missouri (approximately 3-6 inches with isolated 10 inch
128 observations) were relatively rare. Portions of several counties received rainfall with only a 1-in-
129 10 chance of occurring in a given year, with the rainfall maximum near Cabool, Missouri, having
130 only a 1-in-1000 AEP (Figure 3).



131

132 Figure 3. Map of relative rainfall magnitude (as defined by the annual chance of occurrence, or AEP) produced by the NWS Hydrologic Design Studies Center. Source rainfall
 133 used in the analysis was the RFC best-estimate bias-corrected based upon hourly rainfall gauges. Storm total rainfall reports collected post-event were not included.

8 Rainfall Analysis for the Late April into Early May 2017 Flood Event in Southern Missouri and Northern Arkansas

134 **2.0 Methodology**

135 *2.1 Rainfall estimation*

136 In order to refine the rainfall analysis, additional point rainfall data was collected from
137 multiple sources. Once compiled, the rainfall observations were put through a simple QC
138 technique to remove obviously bad data. Next, the point rainfall data was used to bias-correct
139 radar-only rainfall estimates.

140

141 **2.1.1 POINT RAINFALL DATA**

142 The largest single source for additional data was the Community Collaborative Rain
143 Hail and Snow network (CoCoRaHS; manual-reporting stations monitored by a volunteer
144 observer network). Data was also obtained from the public via storm spotter reports (LSR;
145 manually-estimated observations collected in rain gauges with a wide range of quality) and from
146 social media requests (bucket survey; manually-estimated water depths collected in rain gauges
147 and empty containers by the public with a wide range of quality). Although in Lincoln et al
148 (2017) data was also collected from Weather Underground Personal Weather Stations and Davis
149 Instruments, no private weather stations of adequate quality were found in the area of heaviest
150 rainfall and collecting private weather station data for the entire study area was deemed too
151 cumbersome and unnecessary for this report.

152

153 **2.1.2 QUALITY CONTROL OF POINT RAINFALL DATA**

154 The gauge QC technique utilized by Lincoln et al (2017) was used for this analysis.
155 The technique involves a three-tier scale of “fail,” “questionable,” or “pass” based upon

156 comparison of individual gauges against the official NWS bias-corrected, best-estimate rainfall
157 data. Gauges “fail” if they record less than 50%, or greater than 200%, of the bias-corrected
158 radar estimates. Gauges are “questionable” if they record less than 75%, or greater than 150%,
159 but not less than 50% or greater than 200%. Gauges “pass” if they record rainfall between 75%
160 and 150% of the bias-corrected radar estimates. Gauges marked as “fail” were omitted from
161 further analysis.

162

163 2.1.3 GRIDDED RAINFALL DATA

164 The raw gridded rainfall estimates were the radar-only estimates obtained from the
165 MRMS system. Hourly MRMS data was retrieved from the Iowa Environmental Mesonet’s
166 rainfall archive (www.mesnet.argron.iastate.edu/rainfall) and then accumulated from 1200 UTC
167 28 April through 1200 UTC 01 May to provide a 3-d storm total. The MRMS radar rainfall
168 estimates were bias corrected against the point rainfall data that did not fail the QC technique
169 using two different interpolation techniques.

170 The first bias correction technique (method 1) was straight-forward and very similar to
171 the process utilized operationally by the NWS RFCs. The bias correction factor (gauge value
172 divided by raw radar rainfall estimate) was calculated for each gauge location. The bias
173 correction factor point values are then interpolated to a bias correction grid using the kriging
174 method. The kriging method assumed an exponential relationship between distance from
175 observation and bias correction factor. The radar rainfall estimate is then multiplied by the bias
176 correction grid to produce a bias-corrected rainfall estimate.

177 The second bias correction technique (method 2) was similar to the first method -
178 kriging was used to interpolate point bias correction values into a bias correction grid. This

179 second technique differed, however, by utilizing co-kriging (kriging interpolation that involves
180 more than the one variable, distance from point value). The areas of heaviest rainfall occurred at
181 distance from radar locations where the radar beam is sampling thousands of feet above ground
182 level (Figure 4). During some heavy rainfall events with particularly high low-level moisture,
183 radar rainfall estimates can be too low due to the radar beam “overshooting” much of the rainfall.
184 To correct for this, co-kriging was used with the second variable being estimated radar beam
185 height above ground level.

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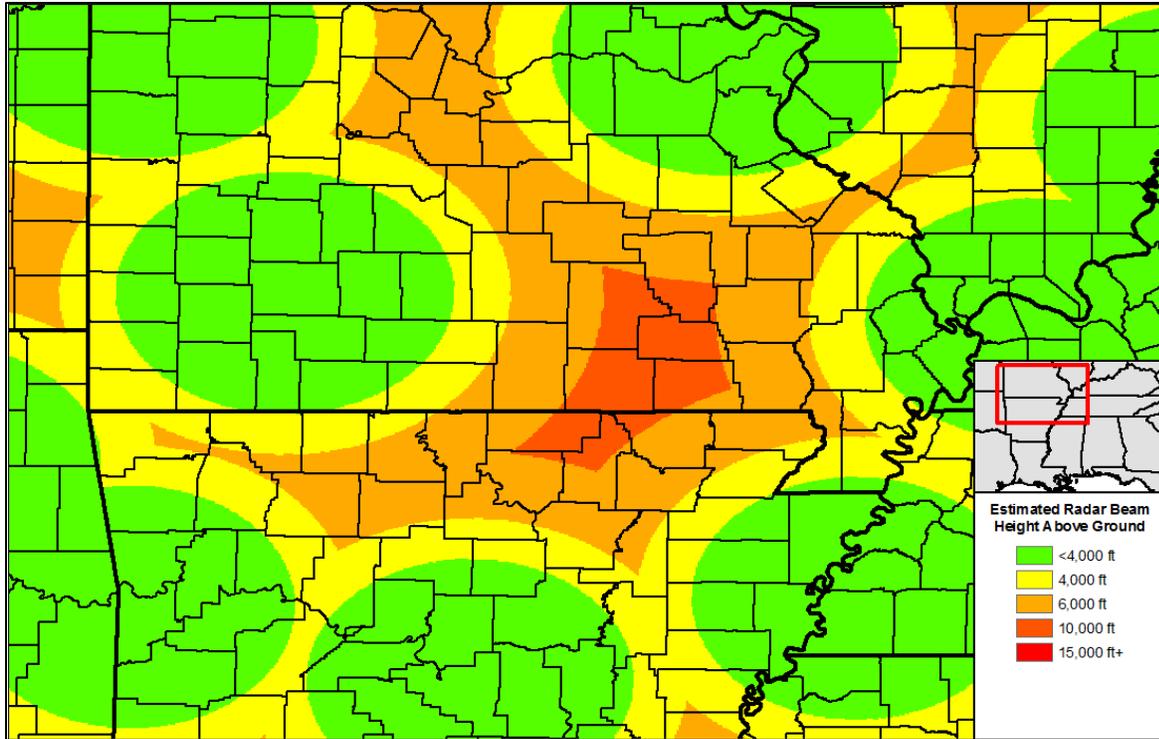
187 *2.2 Rainfall frequency analysis*

188 The bias-corrected rainfall analyses were then compared to rainfall frequency data from
189 NOAA Atlas 14 (National Weather Service, 2013) to determine the storm total rainfall AEP.
190 Selecting the proper rainfall duration to use for calculating the AEP was somewhat difficult,
191 however. Daily rainfall reports used by the NWS span 1200 UTC to 1200 UTC, which makes
192 this rainfall event span three “observation days.” For virtually every location in the study area,
193 however, the rainfall event did not exceed an approximately 48-h duration. Although the start
194 and end times were not exactly the same for each point location, rainfall spanned from roughly
195 2300 UTC 28 April to 2300 UTC 30 April (Figure 5). Thus, although the storm total rainfall
196 would be a 3-d total ending at 1200 UTC on 1 May, rainfall values were compared to rainfall
197 frequency data for the 2-d (48-h) duration to provide the best estimate of event AEP because
198 using the 3-d (72-h) duration would underestimate rainfall severity.

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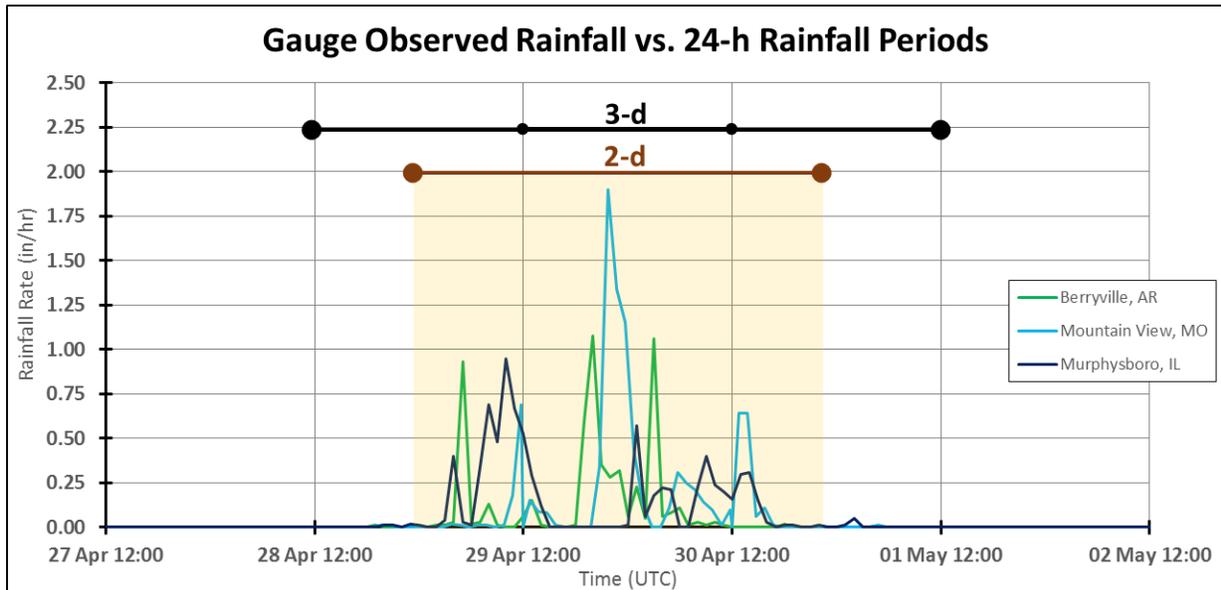
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202 Figure 4. Estimated radar beam height above ground level. Areas of heaviest rainfall from this event were just northwest of areas
 203 where the estimated beam height is typically 10,000 ft or higher above ground level.

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205
 206 Figure 5. Comparison of selected rainfall gauge observations (Berryville, AR, Mountain View, MO, and Murphysboro, IL) to the
 207 typical 1200 UTC to 1200 UTC daily rainfall reporting period used by the NWS. Although the rainfall spanned three observation
 208 days, the actual duration was closer to two days (48-h), from 2300 UTC 28 April to 2300 UTC April 30, 2017.

209 **3.0 Results**

210 *3.1 Point rainfall observations*

211 Approximately 2612 daily and multi-day rain gauge reports were collected for the
212 central United States of which 937 were removed immediately due to missing data. Of the
213 remaining 1675 reports, 900 came from hourly gauges (and a small number of daily gauges)
214 already available for realtime rainfall estimates at the NWS RFCs, 695 came from CoCoRaHS,
215 52 came from LSRs, and 28 came from the bucket survey (Table 1). After removing gauges that
216 failed the QC process, there were 1498 rainfall reports from CoCoRaHS, LSRs, and the bucket
217 survey (social media) available for the analysis (Figure 6). Requesting additional rainfall data
218 from social media (bucket survey) was responsible for the majority of the additional rainfall
219 reports in the area of heaviest rainfall.

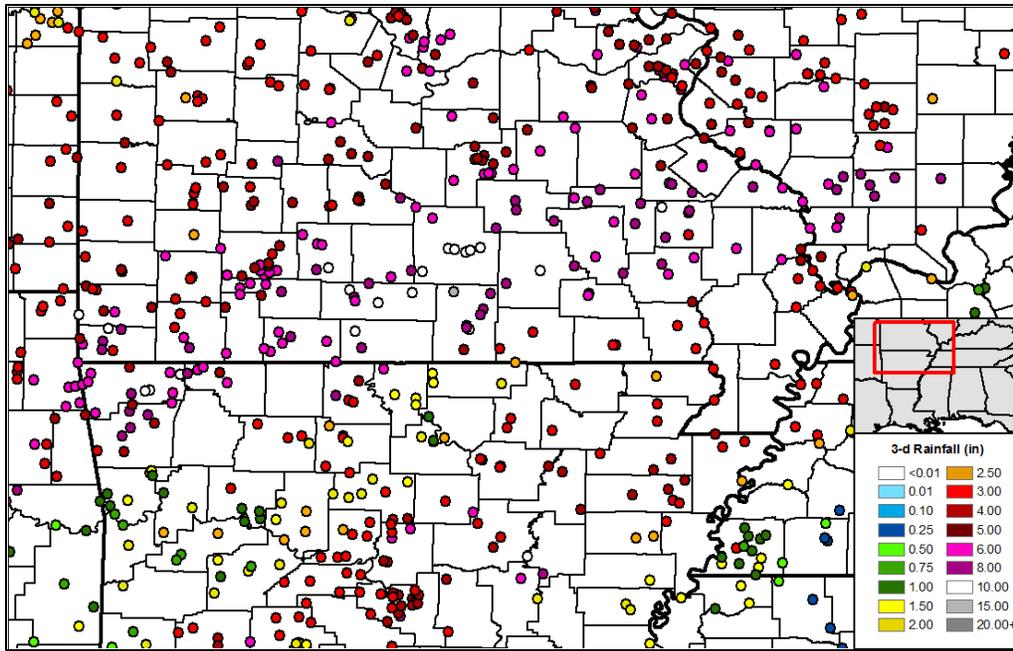
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221 Table 1. Gauge data collected for this analysis. Just under half of these gauges are visible in the study area shown by Figure 6.
222 The rainfall observations collected for this analysis include hourly gauges accumulated to daily totals, daily rainfall totals (such
223 as CoCoRaHS and NWS cooperative observers), and multi-day rainfall totals (such as multi-day CoCoRaHS reports and social
224 media crowd-sourcing). The number of rain gauge reports that did not fail QC are also listed.

	Observations Collected for This Analysis	
	Hourly, Daily, Multi-Day	Post QC
Hourly	900	764
CoCoRaHS	695	654
LSR	52	52
Bucket Survey	28	28
TOTAL	1675	1498

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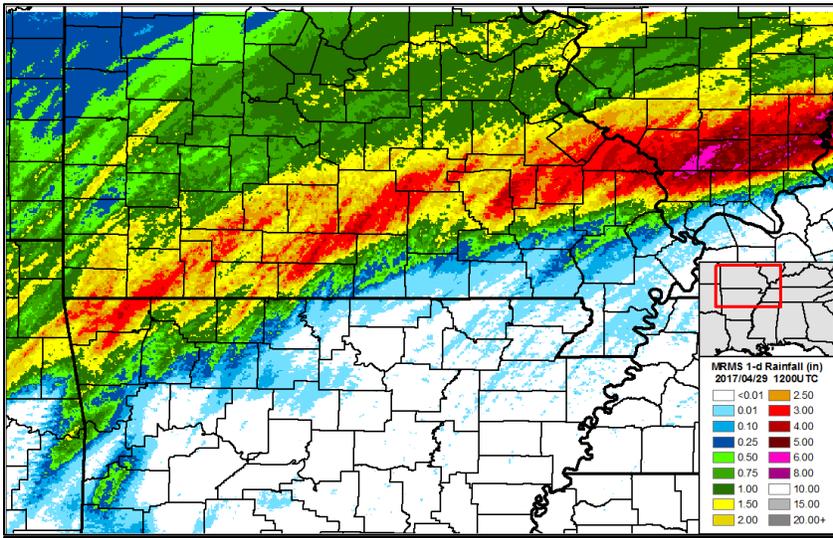


227 Figure 6. 3-day storm total rainfall observations for 1200 UTC 28 April to 1200 UTC 01 May from all point rainfall observations
228 (hourly, daily, and multi-day) – including those added through crowd-sourcing (bottom). Gauges that failed the QC process
229 (section 2.1.2) were excluded.

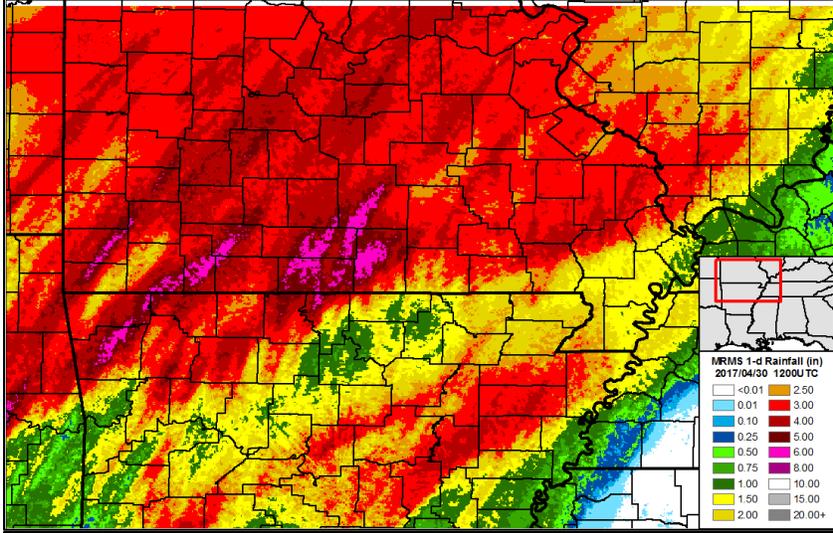
230 *3.2 Radar rainfall estimates*

231 Radar-derived rainfall estimates from MRMS for the 1-day period ending at 1200 UTC
232 29 April 2017 (Figure 7, top) were highest across portions of southern Missouri and southern
233 Illinois. Many locations did not receive significant rainfall outside of this heavy band. Radar-
234 derived rainfall estimates from MRMS for the 1-day period ending at 1200 UTC 30 April 2017
235 (Figure 7, middle) were highest in a small section of south-central Missouri and another area of
236 northeast Arkansas, although rainfall amounts of 3 to 4-in were common throughout the area.
237 Radar-derived rainfall estimates from MRMS for the 1-day period ending at 1200 UTC 1 May
238 2017 (Figure 7, bottom) were much lighter than previous days with most areas receiving less
239 than 1-in. Radar-derived rainfall estimates for entire 3-day period ending 1200 UTC 1 May 2017
240 (storm total rainfall; Figure 8) indicated that the heaviest rainfall amounts (exceeding 10-in)
241 occurred in southern Missouri near Cabool.

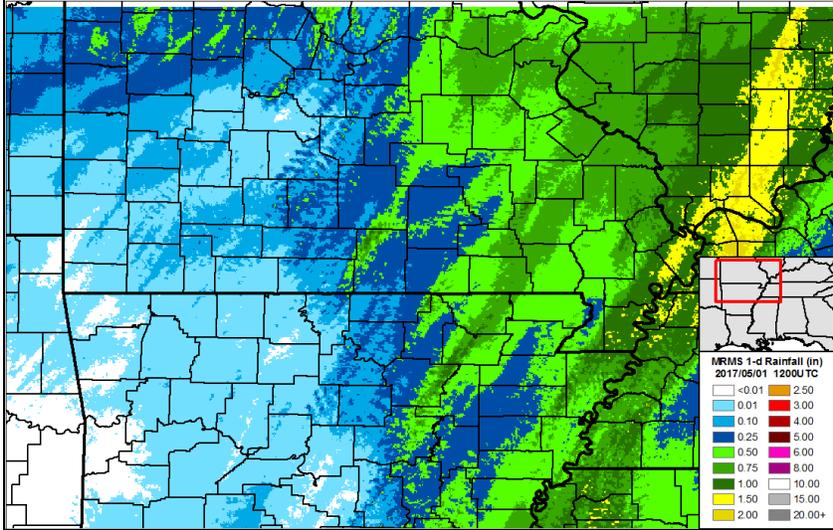
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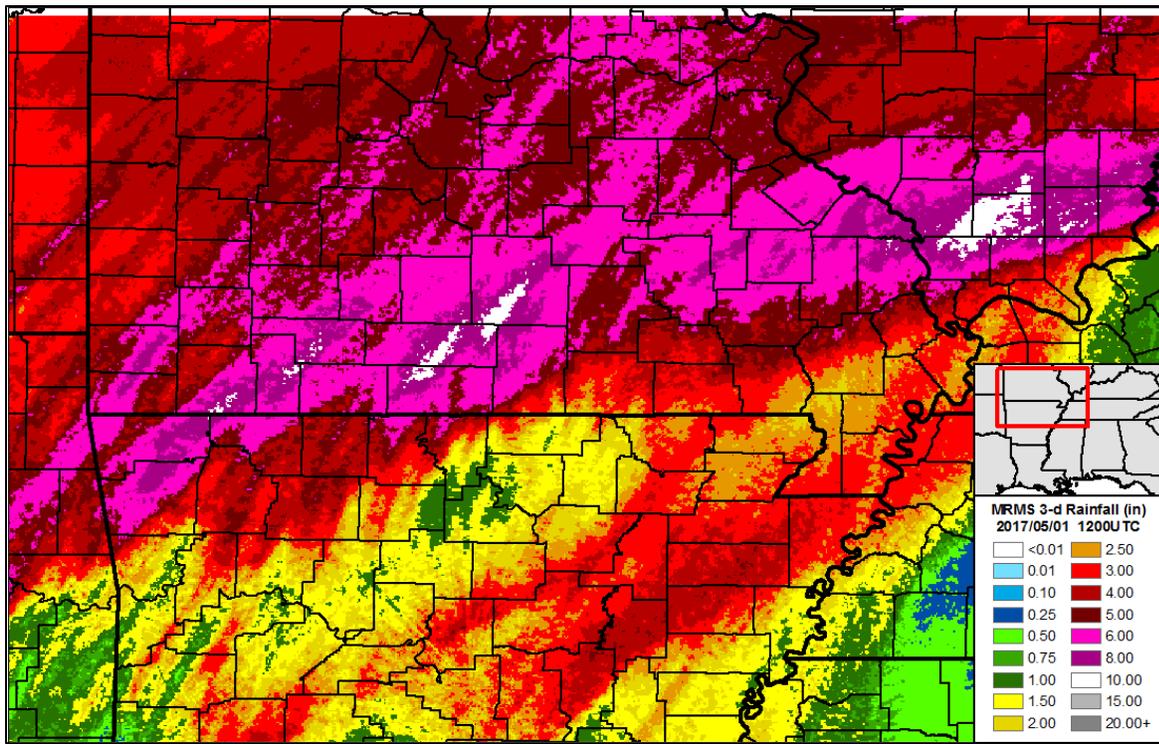


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Figure 7. Daily raw radar rainfall estimates from MRMS ending at 1200 UTC 29 April 2017 (top), 1200 UTC 30 April 2017 (middle), and 1200 UTC 1 May 2017 (bottom). These estimates have no bias correction from rainfall gauges.



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Figure 8. Storm total rainfall estimates from MRMS ending at 1200 UTC 1 May 2017. These estimates have no bias correction from rainfall gauges.

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251 3.3 Bias-corrected radar rainfall estimates

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For both bias correction methods, areas of southern Missouri, northeastern Arkansas,

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and central Arkansas were indicated as areas where the raw radar rainfall estimates were too low

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(Figure 9). Both bias correction methods also indicated far eastern Oklahoma, northwestern

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Arkansas, and southern Illinois as areas where the raw radar rainfall estimates were too high.

256

There was also a general tendency for radar estimates to be too low at distance from radar

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locations and about right or too high close to radar locations, although this did not hold true for

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the radar near Little Rock, Arkansas. The second bias correction method (co-kriging with radar

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beam height as secondary variable) generally had more extremes. Each method placed the storm

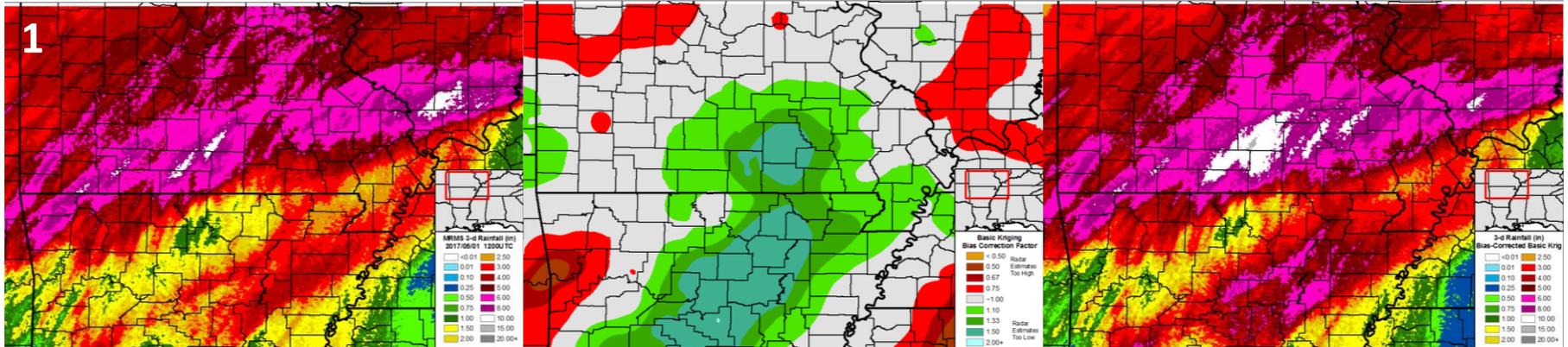
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total rainfall maximum near Cabool, Missouri, with an estimated 17.3-in (method 1) and 19.4-in

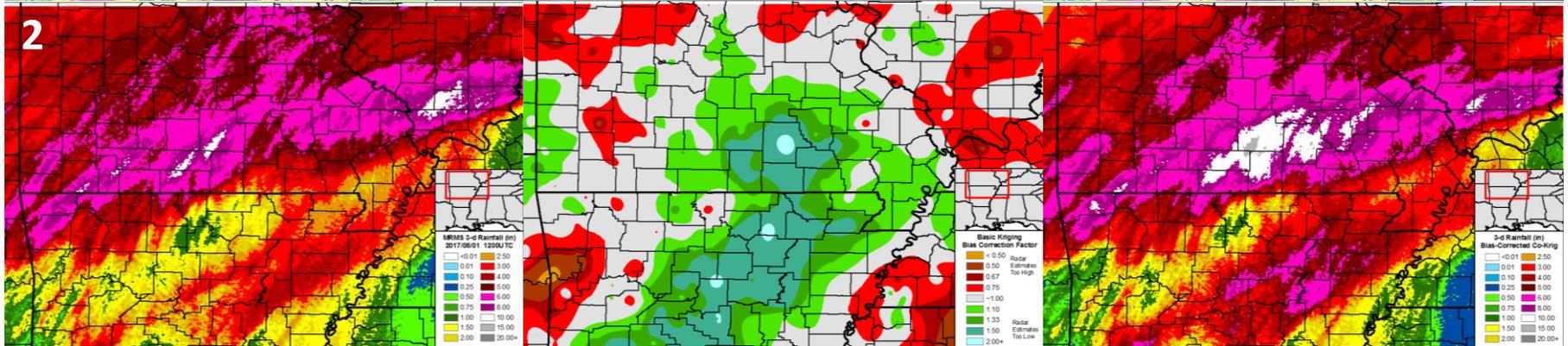
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(method 2). Despite these differences, the rainfall estimates were generally similar.

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264 Figure 9. The bias correction process of method 1 (top; utilizing basic kriging) and method 2 (bottom; utilizing co-kriging). Raw radar-only rainfall estimates (left) are multiplied by the bias
 265 correction factor (middle) to produce the bias-corrected rainfall estimate (right). For the bias correction factor, areas that needed minimal adjustment (bias correction factor ~1.0) are
 266 indicated by gray, areas where the raw radar estimates were too low (bias correction factor >1.0) are indicated by greens and blues, and areas where the raw radar estimates were too high
 267 (bias correction factor <1.0) are indicated by reds and browns.

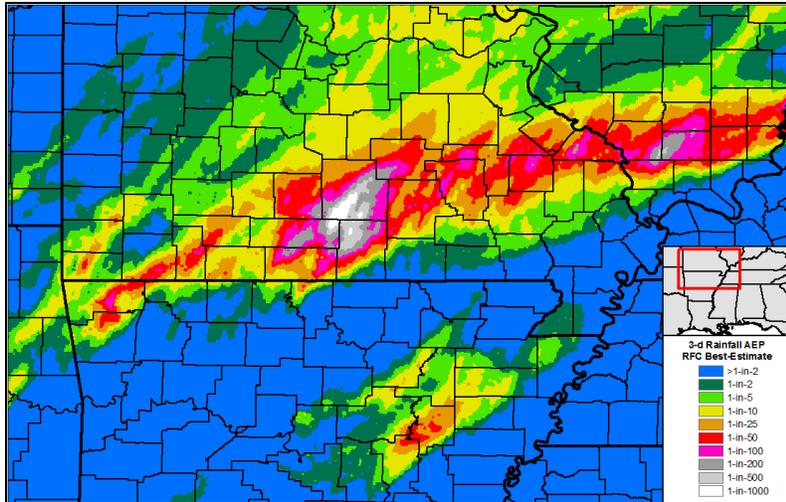
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269 *3.4 Bias-corrected radar rainfall estimate AEPs*

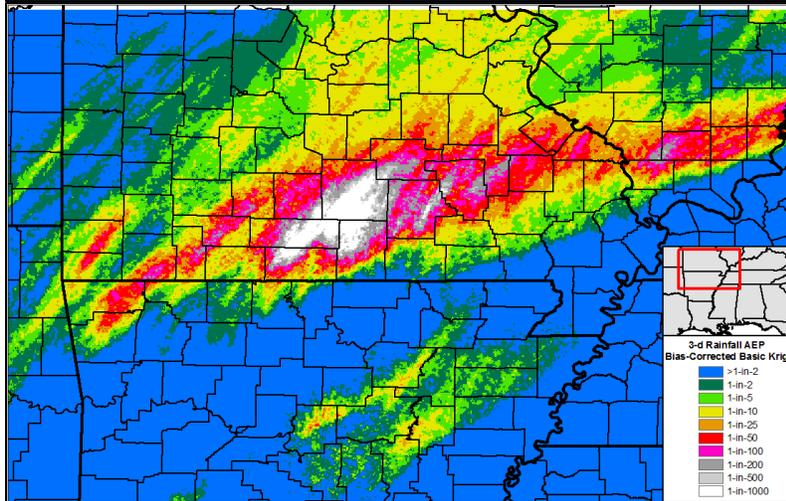
270 Because rainfall estimates produced from each bias-correction method described in this
271 report were generally similar, the AEP values were also quite similar. The AEP for the bias-
272 corrected rainfall produced by both methods indicated widespread areas of extreme rainfall
273 (defined by a 1% or less annual chance) across numerous counties in southern Missouri, several
274 counties in southern Illinois, and a couple counties in far northwestern Arkansas. Rainfall
275 estimates exceeded - in some cases by several inches - the 0.1% AEP (1-in-1000 annual chance)
276 across portions of six counties in south-central Missouri roughly centered near the rainfall
277 maximum at Cabool, Missouri.

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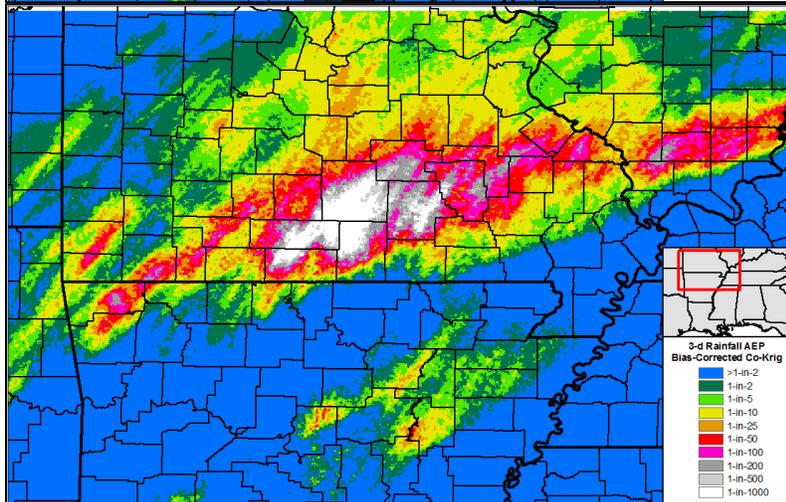
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282 Figure 10. AEP for the bias-corrected rainfall produced by three different techniques. The AEP for the RFC best-estimate rainfall
 283 (biased corrected using only hourly gauges; top), the AEP for the bias-corrected rainfall produced for this analysis by method 1
 284 (basic kriging; middle), and the AEP for the bias-corrected rainfall produced for this analysis by method 2 (co-kriging; bottom).
 285 Both methods from this analysis produced very similar results with rainfall severity increased (compared to RFC best-estimate
 286 rainfall) in many areas.

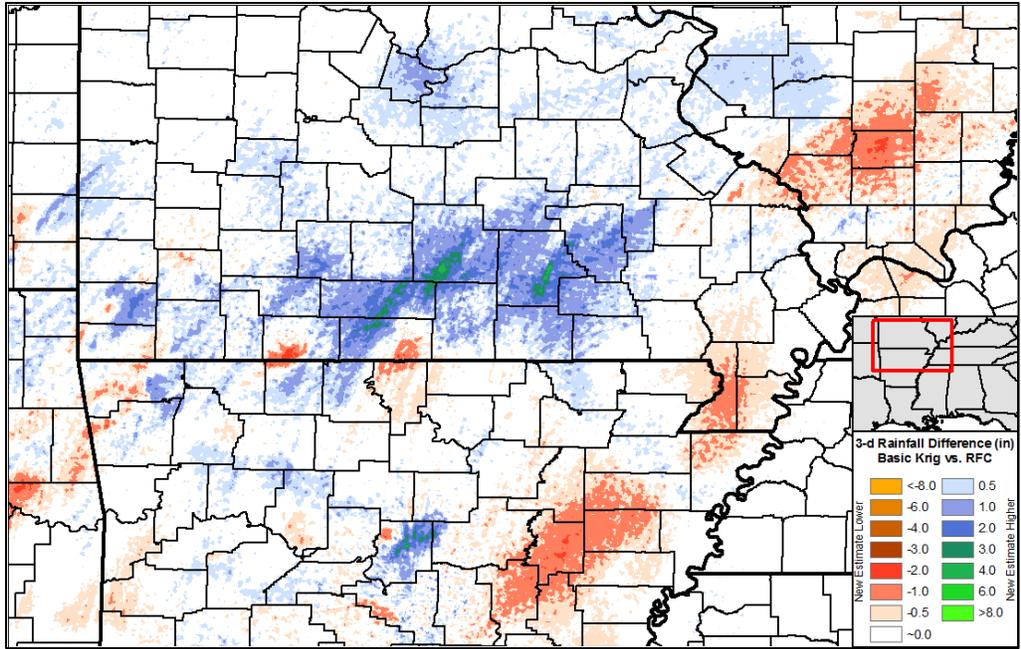
287 **4.0 Discussion**

288 Over 300 additional daily and multi-day rainfall observations (compared to the gauges
289 available for realtime NWS RFC rainfall analysis) were used in this analysis to try increasing the
290 precision of rainfall estimates for the late April 2017 flood event. Due to the substantial number
291 of gauges utilized, manual QC of each observation was not plausible and an automatic, objective
292 QC method was used. No automated QC method is perfect - such methods leave the possibility
293 of some good observations being removed and some bad observations being kept. To better
294 quantify the effect of these additional rainfall reports on the rainfall analysis, the rainfall
295 estimates from each of bias-correction methods were compared to the official NWS RFC best
296 estimate rainfall (Figure 11). The majority of the study area was changed by 0.5-in or less, but a
297 few areas had substantial changes. In particular, the rainfall maximum was increased using both
298 bias correction methods on the order of 4 to 6-in. These increases in rainfall appear plausible due
299 to several factors: 1) the spatially-consistent pattern of increases and decreases throughout the
300 study area, 2) the rainfall maximum occurring away from radar sites which often causes an
301 underestimate of rainfall from radar-based estimates, and 3) the widespread, record flooding that
302 was recorded downstream of areas of heavy rainfall.

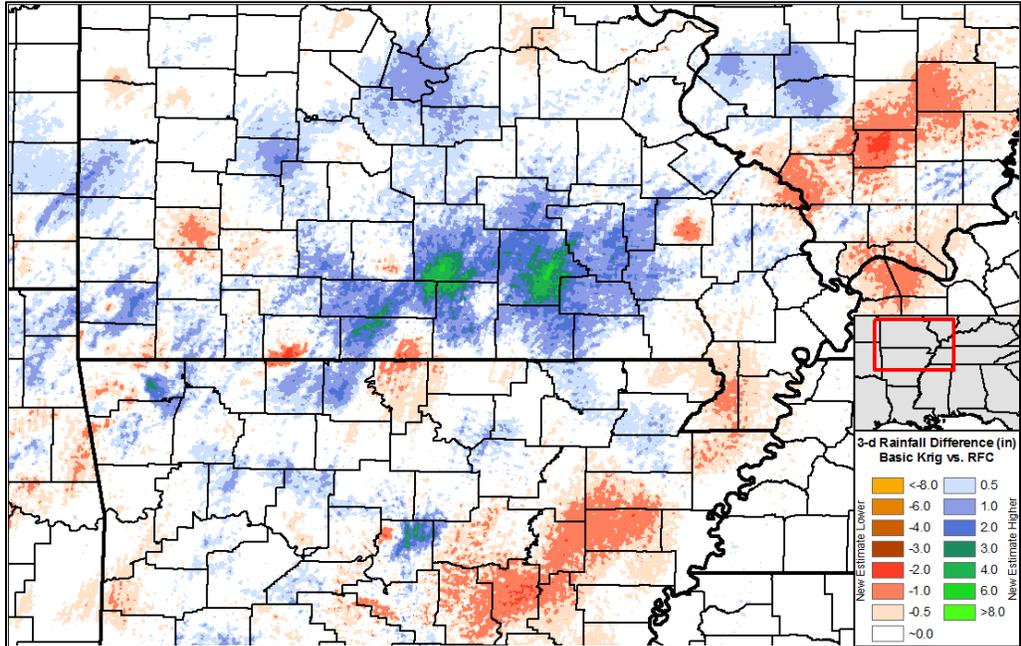
303 It is difficult to determine which bias correction method is best. Although it makes
304 conceptual sense that there would be a relationship between distance from the nearest radar site
305 (and thus, radar beam height) and the over/under-estimating of rainfall estimates, the addition of
306 variables to an already complicated interpolation technique (kriging) may increase uncertainty in
307 ways that are difficult to quantify. The kriging method attempts to quantify uncertainty due to the
308 interpolation by calculating the error at each observation location; this is done by iteratively
309 removing one value at a time and re-interpolating. Verification statistics for each of these bias

310 correction techniques ended up quite similar; each had a tendency to poorly predict isolated
311 gauges that were higher or lower than the surroundings. This had the effect of smoothing out
312 point minima and point maxima. Despite the differences between bias correction techniques,
313 each consistently increased rainfall values near the rainfall maximum and the resulting AEP
314 analysis was similar.

315



316



317 Figure 11. Difference between the bias-corrected rainfall produced by method 1 (basic kriging; top) and method 2 (co-kriging;
318 bottom) and the official RFC best estimate rainfall. Positive values indicate areas where this new analysis raised rainfall estimates
319 and negative values indicate areas where this new analysis lowered rainfall estimates.

320

321 **5.0 Conclusions**

322 Very heavy rainfall which occurred between 1200 UTC 28 April 2017 and 1200 UTC 1
323 May 2017 caused widespread flooding across multiple states in the Midwest United States.
324 Additional rainfall data was collected to better analyze this extreme rainfall event. The additional
325 gauges changed the storm total maximum near Cabool, Missouri, from just over 10-in to at least
326 17.3-in (depending on the bias correction method used). Away from the area of heaviest rainfall,
327 these new rainfall estimates were similar to earlier estimates, within 1 to 2-in. Rainfall AEPs for
328 the 48-h duration indicated that extreme rainfall occurred across a large portion of southern
329 Missouri and portions of northern Arkansas with rainfall exceeding the 1-in-1000 annual chance
330 rainfall for parts of at least six Missouri counties. Widespread, significant flooding occurred as a
331 result of this extreme rainfall, with numerous stream gauge locations setting new stage records.
332

333 **6.0 Acknowledgements**

334 The author would like to thank Suzanne Van Cooten at the NWS LMRFC for the data
335 extraction of point rainfall observations and David Welch for his review and helpful comments.

336

337 **7.0 Works Cited**

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