Doppler RADAR and Precipitation Depth Correlation
for the Arid Region of San Bernardino County

Investigators
Theodore V. Hromadka, II, Ph.D., Ph.D., Ph.D., D. WRE, PE, L.G., P.H.
Professor, Department of Mathematical Sciences, United States Military Academy, West Point, NY
Prasada Rao, Ph.D., Professor, California State University Fullerton
Rene A. Perez, PG, CHG, Senior Geoscience Consultant, Hromadka & Associates
COL Doug McInvale, PhD., Department of Mathematical Sciences, United States Military Academy,
West Point, NY

Final Report Submitted to
Water Resources Division
Public Works
825 E. 3rd Street
San Bernardino, CA 92415-0835

Agreement Number: PO 165215
Work Period: 08/01/2015 – 08/15/2017
Contents

1. Introduction 1
2. Doppler Radar Assessment Update for the Arid Regions of the County of San Bernardino 1
   2.1 Doppler Candidate Storms 1
   2.2 NOAA NEXRAD DATA Acquisition and Storm Animation 2
   2.3 Analysis of RADAR Animation and Peak Durations 2
   2.4 Import RADAR data into GIS 3
   2.5 Preparation of Correlation between Doppler Estimated Precipitation versus Doppler Depicted Aerial Extent of Precipitation 4
   2.6 Comparison of Radar to Precipitation Correlations to Published Rainfall Depth-Area Curves 5
   2.7 Stand-Out Arid Area Storms 8
      2.7.1 La Quinta storm 1 details (Tropical Storm IVO) 8
      2.7.2 La Quinta storm 2 details (Hurricane Norbert Storm) 9
3. Conclusion and Recommendation 10
4. Note from the Funding Agency 11
Appendix 12-31

List of Figures

Figure 1. Analyzed storm locations during 1997-2015 period 3
Figure 2. Key storm event radar aerial coverage locations 4
Figure 3. Comparison of Depth Area Reduction Factor for Key Storms 5
Figure 4. Comparison of 1 hour DARF curves 7
Figure 5. Comparison of 6 hour DARF curves 7
Figure 6. Comparison of 24 hour DARF curves 8
Figure 7. Path of Hurricane Nobert 9
Figure 8. Thunderstorms produced by the remnants of Hurricane Norbert 10

List of Tables

Table 1. Comparison of 1-hour Peak Duration Precipitation Depth-Area Reduction Factors 6

Encl: A USB drive that has all the storm rainfall data from the radars that was used in the analysis
1. Introduction

The use of Doppler Radar information for rainfall and storm analysis is an evolving technology and is subject to continuing research as to its applications in hydrometeorology and surface water hydrology. An approach being applied in the current study is to use such data for development of correlations between Doppler Radar data and associated aerial extent, and rain gage data corresponding to the Radar data. This approach assembles and identifies peak storm durations of interest in storm hydrometeorology and storm runoff hydrology, and then synthesizes the data using GIS technology to estimate area-averaged rainfall accumulated depths versus watershed area coverage. In this way, by examining different peak precipitation durations and corresponding rainfall depths, a correlation to associated Radar data may be possible. The candidate storms assembled are available from Doppler data assembled across most of the flood control agencies involved with arid hydrology in the Southwest United States. Hundreds of candidate storms were identified and examined for various attributes, resulting in reducing the total population of storms considered. For each candidate storm moved forward in the analysis, various peak duration time-frames are examined and accumulated precipitation depths determined versus watershed area.

These accumulated precipitation depth estimates are then plotted against area of Doppler Radar extent measured by the Radar stations, resulting in a possible correlation between Radar extent and precipitation gage coverage. It is noted that due to the scarcity of precipitation data, Doppler Radar data are used along with the actual precipitation gage data. Assuming Doppler RADAR data are proportional to actual point rainfall (with the constant of proportionality varying between storm events), once these results are normalized by dividing by the one square mile rainfall depth (on a storm by storm basis), the constant of proportionality divides out in the normalization process and hence does not need to be determined directly for each storm considered.

The goal of this study is to leverage the Doppler RADAR data available for the arid San Bernardino County area to correlate with rain gage data where available. The arid portion of San Bernardino County covers approximately 20,000 square miles which are currently monitored by 41 rain gages with hourly or shorter duration data (excluding daily gauges). The focus was to update the previous RADAR depth area investigation completed for the county in 2007, in which RADAR data collected and analyzed for storms event occurring between 1997 to 2006. This current study take advantage of eight additional years of RADAR data collected through 2015.

2. Doppler Radar Assessment Update for the Arid Regions of the County of San Bernardino

2.1 Doppler Candidate Storms

The goal of this study is to leverage the Doppler Radar data available for the San Bernardino arid area and to develop correlations of the Doppler Radar areal coverage to precipitation gage data that corresponds to the storm events analyzed with respect to the radar data. These new correlations will be useful to refine similar relationships throughout the arid area of the San Bernardino County. The arid portion of San Bernardino County includes approximately 20,000
square miles of area, which are currently monitored by 77 precipitation gages with hourly or shorter duration data (excluding daily gauges). Based on the data from these 41 gauges, 156 storm dates with return frequencies estimated using the National Weather Service (“NWS”) to be greater than 10-year were identified as occurring between years 1997 and 2006. These candidates were then forwarded to Doppler Radar analysis. [Based on the data from these 36 gauges, 55 storm dates with return frequencies greater than 10-yr were identified between years 2007 and 2015 as candidates for Doppler Radar analysis.]

2.2 NOAA NEXRAD DATA Acquisition and Storm Animation
Since the arid region of San Bernardino County encompasses a vast area, multiple RADAR Sites were analyzed for storm events. The Radar sites include: Yuma (KYUX), Edwards (KEYX), Santa Ana (KSOX), Las Vegas (KESX), and San Diego (KNKX). After the storms of interest were identified, the NOAA Radar (NEXRAD) data was obtained and downloaded off the NOAA website (www.ncdc.noaa.gov/nexradinv/) for each of the candidate storms (Figure 1). In particular, the LVL3-one-hour precipitation product was obtained. These files contained data in 5-minute intervals for the entire storm period. The LVL3-one-hour data summarizes 1-hour precipitation intensity by assigning the precipitation amounts to a 2km by 2km grid. When the data are exported to a geographic information system (GIS), the 2km by 2km grids are further broken down into 0.086 mile by 0.086 mile grids (oriented to true north). Each of these refined grid points are assigned the original value based on the initial 2km by 2km grid. When the data are animated using NOAA’s NCDC Java NEXRAD Viewer and Data Exporter [currently known as NOAA Weather and Climate Toolkit], the intensity of precipitation can be seen as a storm moves across a region, much like the Doppler Radar tracking commonly used in TV weather & news broadcasts. For each of the candidate storms, three days of data were obtained (when available). By including data for the day before the candidate storm, and the day after the candidate storm (date of interest in the middle), a more complete picture of the storm event was rendered even if it began in the evening of the previous day or continued through the night into the following day.

2.3 Analysis of RADAR Animation and Peak Durations
Using the techniques described above, a Doppler animation was created for the 156 [+55 candidate 2007-2015] candidate storm events that have available data (Figure 1). From these animations, the 3-hr, 2-hr, 1-hr, 30-minute and 15-minute peak rainfall peak durations were identified. Based on the intensities for each target peak duration interval, the most significant storms (Figure 2) were identified for further analysis.
Some storms were eliminated from further consideration for one of the following reasons:
   a) no Radar data available for the date
   b) available Radar data was corrupt
   c) no storm appeared on the Radar as being recorded at the rain gauges
   d) the storm was not a top-ranking storm
   e) if same storm was measured on multiple Radar sites, the site with the best coverage was selected.

2.4 Import RADAR data into GIS

1997-2006 data assessment

By applying this criteria to the San Bernardino County area storm events, a total of 14 candidate storms were selected as being significant; however, two candidate storms were eliminated because of questionable data. The 12 remaining significant storms were examined at the peak 3-hour, 2-hour, 1-hour, 30-minute, and 15-minute durations. The original raw Doppler Radar data for these intervals were then exported for analysis. The 5-minute Radar files for the key durations were exported as an ASCII grid file by the NEXRAD Viewer and Data Exported to be imported into GIS. Prior to being imported into GIS, the 5-minute 1-hr intensity files were converted to accumulated depths for the peak intervals of interest (3-hr, 2-hr, 1-hr, 30-minute and 15-minute) using a scripted routine that calculated the accumulations from the 5-minute files. This was done by summing the ACSII grid files for each duration.
Figure 2. Key storm event radar aerial coverage locations

**2007-2015 data assessment**

The same criteria as described above was applied, however, due to the recent upgrades to NOAA Weather and Climate Toolkit, a few processing steps were bypassed. The toolkit currently has the capabilities of converting the 5-minute 1-hr intensity files into accumulated depths for the peak intervals (3-hr, 2-hr, 1-hr, 30-minute and 15-minute), the output summation was then imported into GIS.

The accumulation grid files of the peak durations for the significant storms were then imported into GIS in order to locate the isolated storm cells and identify their areas of influence on a map.

**2.5 Preparation of Correlation between Doppler Estimated Precipitation versus Doppler Depicted Aerial Extent of Precipitation**

After exporting the Doppler Radar data from GIS into Excel as ASCII point files, area average depths were calculated for each duration. The imported ASCII point files contained three values (the centroid X-coordinate, the centroid Y-coordinate and a depth value); however, the X- and Y-coordinates were not required for depth analysis. The distribution depths were partitioned into intervals such that the number of instances with depths greater then 0.1, greater than 0.2, greater than 0.3, etc… was recorded (using increasing increments of 0.1). This procedure continued until the maximum depth value was reached. The number of instances for each partial value was then
multiplied by a conversion scaling factor to derive an associated area in square miles (cell size). Using these values, an average normalized depth for each interval was calculated and the area versus average depth for a given interval was plotted in Excel (Figure 3).

**Figure 3.** Comparison of Depth Area Reduction Factor for Key Storms (the storm details are listed in Table 1)

### 2.6 Comparison of Radar to Precipitation Correlations to Published Rainfall Depth-Area Curves

To assess comparability between the derived Radar to Precipitation correlation curves for the examined analyzed storm events, these Radar to Precipitation correlation curves were compared to the Depth-Area Factor Adjustment curves developed and published in various County Flood Control District Hydrology Manuals. The Depth-Area Factor Adjustment curves published in the San Bernardino County’s 1983 Hydrology Manuals are based upon data including the Los Angeles area 1943 Sierra-Madre storm event as assessed by US Army Corps of Engineers (USACOE). In comparison, the Riverside County Flood Control District (RCFCD) Depth-Area Factor Adjustment curves are based upon the NOAA Atlas 2 published in year 1973. The RCFCD curves were originally published by the US Weather Bureau in year 1957, and are based
on storm events that occurred in IL, IA, MO, NJ, NY, SC, and AL (for example, see US Weather Bureau, TP29, 1957).

Other similar adjustment factor relationships are available in the published literature and can be collected for comparison among other purposes. Such adjustment relationships were compared from the following agencies:

- Nevada Department of Transpiration (NVDOT) by Vieux & Associates, Inc.
- Riverside County Hydrology Manual (NOAA Atlas 2)
- Clark County Regional Flood Control District (CCRFCD)
- Truckee Meadows Regional Drainage Manual (TMRDM)
- Maricopa County Hydrology Manual
- Arizona Department of Water Resources

A comparison of Depth Area Reduction Factors (DARF) values are shown in Table 1, and Figures 4 through Figure 6, below from the several considered agencies and from several of more significant storm events analyzed in the current study.

**Table 1. Comparison of 1-hour Peak Duration Precipitation Depth-Area Reduction Factors**

<table>
<thead>
<tr>
<th>1H Comparison*</th>
<th>50 mi²</th>
<th>100 mi²</th>
</tr>
</thead>
<tbody>
<tr>
<td>8/25/2013 (KNKX)</td>
<td>0.99</td>
<td>0.89</td>
</tr>
<tr>
<td>9/7/2014 (KESX)</td>
<td>0.87</td>
<td>0.78</td>
</tr>
<tr>
<td>8/25/2013 (KSOX)</td>
<td>0.84</td>
<td>0.63</td>
</tr>
<tr>
<td>4/13/2012 (KEYX)</td>
<td>0.83</td>
<td>0.73</td>
</tr>
<tr>
<td>8/25/2013 (KYUX - La Quinta Storm 1)</td>
<td>0.82</td>
<td>0.73</td>
</tr>
<tr>
<td>8/13/2004 (KESX)</td>
<td>0.80</td>
<td>0.65</td>
</tr>
<tr>
<td>Riverside County Manual (NOAA Atlas 2)</td>
<td>0.80</td>
<td>0.73</td>
</tr>
<tr>
<td>9/19/2004 (KESX)</td>
<td>0.79</td>
<td>0.73</td>
</tr>
<tr>
<td>9/8/2014 (KYUX - La Quinta Storm 2)</td>
<td>0.78</td>
<td>0.61</td>
</tr>
<tr>
<td>9/11/2004 (KESX)</td>
<td>0.71</td>
<td>0.53</td>
</tr>
<tr>
<td>Nevada 90% DOT (Vieux)</td>
<td>0.68</td>
<td>0.55</td>
</tr>
<tr>
<td>10/15/2015 (KEYX-Palmdale)</td>
<td>0.61</td>
<td>0.46</td>
</tr>
<tr>
<td>12/22/2010 (KSOX-Highland)</td>
<td>0.51</td>
<td>0.42</td>
</tr>
<tr>
<td>San Bernardino County Depth Area Curve</td>
<td>0.50</td>
<td>0.40</td>
</tr>
</tbody>
</table>

*The data is identified by the storm date and the radar site (KNKX – Sa Diego, KESX – Las Vegas, KSOX – Santa Ana, KYUX – Yuma, KEYX - Edwards)
Figure 4. Comparison of 1 hour DARF curves

Figure 5. Comparison of 6 hour DARF curves
2.7 Stand-Out Arid Area Storms

The La Quinta area of Southern California was subjected to two severe storms in successive years. Each storm was of remarkable rainfall intensity over approximately one hour durations. The second storm occurred in year 2014 with the first occurring in year 2013. Both storms caused significant flood damages, with the 2014 event being more severe and consequently, is displayed in the current paper. These are identified as La Quinta storm 1 (8/25/2013) and La Quinta storm 2 (9/8/2014) and briefly detailed below.

2.7.1 La Quinta storm 1 details (Tropical Storm IVO)

The remnants of Tropical Storm Ivo (8/25/2013) brought an influx of moisture into Southern California which resulted in heavy rainfall and flash flooding in the deserts of San Bernardino Riverside County. In the city of La Quinta more than 2.0 inches fell in a short period of time.
2.7.2 La Quinta storm 2 details (Hurricane Norbert Storm)

Hurricane Norbert (September 06, 2014) formed of the coast of south-central Mexico and moved northwesterly along Baja California where moisture from its remnants was pulled north (Figures 8, 9). The remnants of the hurricane brought significant moisture to the southern portion of California, Nevada and Arizona. The circulation of Norbert along with the remnants of Atlantic Tropical Storm Dolly, spread moisture across northwest Mexico and into the southwestern United States (NOAA, 2014a). Eight to eleven storm cells began to form in the Coachella valley, the migration propagated easterly to the Las Vegas area and then to Phoenix Area. Significant Rainfall occurred in Palm Springs and La Quinta Area. In Arizona 6.09 inches occurred near Chandler. At Phoenix Sky Harbor Airport during a seven-hour period 3.30 inches of rainfall occurred. It was also the largest daily rainfall in a single calendar day since records began in 1895 (NOAA, 2014b). Approximately a third of Maricopa’s County rain gauges set all-time records.

![Figure 7. Path of Hurricane Norbert](http://www.weathernationtv.com/news/hurricane-norbert-churns-in-pacific-potentially-bringing-flooding-rains-to-parched-desert-southwest/)
Figure 8. Thunderstorms produced by the remnants of Hurricane Norbert
(https://www.nasa.gov/sites/default/files/arizona_storm_8_september_2014_1205_utc_trmm_pr.jpg)

3. Conclusion and Recommendation

In this study, the assembly and resolution of the many DOPPLER arid hydrology storm events has resulted in valuable information for use now and far into the future. Observed in this effort are at least two "stand-out" arid area storm events of particular interest. Namely, the years 2013 and 2014 storm events that are well documented in the La Quinta area, of Riverside County California. These particular storm events moved through the City of La Quinta area and also impacted the highly urbanized areas of Phoenix, Arizona and also Las Vegas, Nevada, among other arid areas (See Figure 9). These two large cities are the homes of the highly respected hydrometeorological monitoring and assessment Groups in the Maricopa County Flood Control District, and also the Clark County Flood Control District, respectively. A more recent storm event in October 2015 that delivered a remarkably high return frequency one hour precipitation event occurred in the Palm Desert area of the Los Angeles County Flood Control District. These Agencies published very high return frequency estimates for the subject 2013 and 2014 events of up to 900-year return frequency.

The comparison of the Doppler data based peak duration estimates versus estimated precipitation aerial extent, both variables estimated by the algorithms integrated into the NWS available information, and subsequent comparison with the published DARF curves in the relevant flood control agency Hydrology Manuals cited, suggests that an underlying correlation may exist. However, at this time, more data are needed to pursue this hypothesis, and therefore, such a conclusion would be premature.
4. Note from the Funding Agency

The County of San Bernardino Flood Control District’s participation in the funding of this research was an academic exercise to understand the relationship between radar data and rainfall rates and must not be used for design considerations in the County of San Bernardino. The District has embarked on an aggressive program to install more rain gages in the arid regions of the County of San Bernardino which will provide more localized rainfall data for a future research project.
Appendix

(A journal manuscript from this research effort has been prepared for review and possible publication in Journal of Hydrometeorology. This manuscript is included in the appendix.)
EVALUATION OF DOPPLER RADAR DATA FOR ASSESSING DEPTH-AREA REDUCTION FACTORS FOR THE ARID REGION OF SAN BERNARDINO COUNTY

Theodore V. Hromadka, II, Ph.D., Ph.D., Ph.D., D. WRE, PE, L.G., P.H., Professor, Department of Mathematical Sciences, United States Military Academy, West Point, NY

Rene A. Perez, PG, CHG, Senior Geoscience Consultant, Hromadka & Associates

Prasada Rao, Ph.D., Professor, Department of Civil and Environmental Engineering, California State University Fullerton

Ken Eke, PE, Department Head, San Bernardino County Department of Public Works, Water Resources Division

Hany Peters, PE, Chief, San Bernardino County Department of Public Works, Water Resources Division

COL Doug McInvale, PhD., Department of Mathematical Sciences, United States Military Academy, West Point, NY

ABSTRACT
Advances in Doppler Radar technology has led to considerable new equipment and software advances for this application. However, much work continues to be needed in the improvement of Doppler Radar predictions including the estimation of precipitation quantities. Other applications of Doppler Radar includes assessment of storm aerial extent versus the magnitude of the precipitation intensity, among other topics of research. In this paper, we review the literature regarding reported issues concerning the use of Doppler Radar for hydrometeorological purposes, and in addition, assessment of the use of Doppler Radar collected over the last two decades in the arid southwest of the United States, in the County of San Bernardino, California, as well as other arid regions. These measures are then compared with Depth-Area Adjustment Factors ("DARF") curves developed and adopted by several flood control agencies located in the study area.

1 Introduction
The use of Doppler Radar information for rainfall and storm analysis is an evolving technology and is subject to continuing research as to its applications in hydrometeorology and surface water hydrology. An approach being applied in the current study is to use such data for development of correlations between Doppler Radar data and associated aerial extent, and rain gage data and algorithmic estimates of precipitation developed by the National Weather Service ("NWS"), associated with the Radar data. This study approach assembles and identifies peak storm durations of typical key interest in storm hydrometeorology and storm runoff hydrology, and then synthesizes the data using GIS technology to estimate area-averaged precipitation.
accumulated depths versus watershed area coverage. In this way, by examining different peak precipitation durations and corresponding precipitation depths, a correlation to associated Radar data may be examined.

The information corresponding to the candidate storms examined in this study includes Doppler radar data collected from several flood control agencies involved with arid hydrology and located in the southwest regions of the United States. Hundreds of candidate storms were identified and examined for various attributes, resulting in reducing the total population of storms considered. For each candidate storm moved forward in the analysis, various peak duration time-frames (of typical key interest in hydrometeorology and flood control) are examined, and then accumulated precipitation depths were determined versus radar displayed precipitation coverage area.

These accumulated precipitation depth estimates are then plotted against the shown coverage area of the Doppler radar extent as depicted by the radar visualization from the radar stations, resulting in a possible correlation between radar extent and radar estimated precipitation aerial coverage. It is noted that due to the scarcity of precipitation data, Doppler radar data are examined along with the actual precipitation gage data in order to assess possible correlation between these two types of data.

The goal of this study is to assess the possible correlation between the available Doppler Radar data (hereafter, “Doppler data”) versus aerial extent relationships (as also estimated by the Doppler data), and the DARF relationships previously derived for these SBC arid areas and also nearby arid regions. The arid portion of San Bernardino County (“SBC”) covers approximately 20,000 square miles which are currently monitored by 41 rain gages with hourly or shorter duration data (excluding in this count the daily gauges).

The focus of this study was to update the previous radar depth area investigation completed for the SBC in year 2007, in which Doppler data were collected and analyzed for storm events occurring between years 1997 to 2006. This current study takes advantage of eight additional years of Doppler data collected through year 2015.

2 Overview of WSR-88D

In the following, we briefly review the evolution of radar technology, the relevant equations used in the interpretation of these data, and then summarize some of the published works where radar-estimated precipitation estimates are compared with rain gage measured data.

Radar technology has been helping weather forecasters in providing timely and useful rainfall forecasts to the public. Ever since RADAR (RAdio Detection And Ranging) was first used in the second world war to detect aircraft, the application for predicting weather phenomena (in particular, rainfall) has been fast maturing, both in the equipment used at the radar stations and also advances in the data processing software which analyzes the scanned radar data and processes them to arrive at precipitation estimates. The time evolution of radar equipment from
S-band (WSR-57) to WSR-88D, and to the current Dual Polarization technology, is shown in Table 1 (Seene, 2013).

Table 1. Time evolution of radar

<table>
<thead>
<tr>
<th>Year</th>
<th>Radar description</th>
</tr>
</thead>
<tbody>
<tr>
<td>1947</td>
<td>Initiation of the RADAR network, using World War 2 technology</td>
</tr>
<tr>
<td>1959</td>
<td>S-band weather RADAR initiated (WSR-57)</td>
</tr>
<tr>
<td>1976</td>
<td>Installation of additional S-band WSR-74 RADAR</td>
</tr>
<tr>
<td>1990-96</td>
<td>Installation of the 157 NEXRAD Doppler RADAR across the U.S. (WSR-88D)</td>
</tr>
<tr>
<td>2011-12</td>
<td>Upgrading the NEXRAD to Dual Polarization RADAR</td>
</tr>
</tbody>
</table>

While every enhancement and upgrades, has provided with improvements in the estimation of precipitation quantities, a major technology development came with the advent of NEXRAD network (WSR-88D) which has proven to be a corner stone in modern weather technology. This evolution was primarily motivated by the need to detect severe storms and precipitation events. The WSR-88D is an offshoot of the advances made in Doppler signal processing theory, scientific knowledge of precipitation characteristics, advances in hardware capabilities and visualization software tools, among other factors. All these developments combined to provide a significant enhancement towards predicting precipitation quantities with a greater accuracy. The precipitation processing system in the WSR-88D was consequently deployed to enhance the flood forecasting abilities of several governmental agencies and private concerns. The works of Doviak and Zrnic, 1993; Fulton et al., 1998; Smith et al., 1996; Serafin, 1996; Whiton et al., 1998, and the references in their works, provide deeper insight and rich resources for description of the NEXRAD system.

The Weather Surveillance Radar (WSR-88D) is the technical name for the 159 high resolution S-band Doppler weather Radar (see Figure 1) which are part of the NEXRAD (Next Generation Radar) network, and are operated by the National Weather Service. The WSR-88D radar operates by sending and receiving microwave pulses, in the 2-4 GHz range, known as S band. Because the WSR-88D can estimate precipitation at high spatial and temporal resolution, it has high potential for hydrometeorological assessment including use in meteorological and hydrological modeling. The Doppler Radar transmits radio waves/pulses, at a rate of 1000 pulses/second, along a target path. These waves (when they hit the raindrop or hail or other interference) bounce back and a part of the transmitted energy is scattered back and received by the Radar receiver. This reflected signal is the result of the energy from the transmitted pulse interacting with cloud (cloud water and cloud ice) and precipitation (snow, ice pellets, hail, and rain) particles.
Figure 1. Locations of the WSR-88D RADAR sites in mainland United States
[https://radar.weather.gov/]

2.1 Mathematical Models Typically Used to Estimate Precipitation from RADAR Data

The commonly employed formulation used in the estimation of precipitation from RADAR information is the Probert-Jones equation given by (Probert-Jones, 1962; Austin, 1987)

\[ P_r = \frac{CkZ}{r^2} \]

where \( P_r \) is the returned energy received back by the radar, \( C \) is a parameter based constant (depends on transmitted power, beam width, transmitted energy wavelength, antenna gain, pulse length, target character), \( k \) is reduction in the signal attenuation along the propagation path, \( r \) is the target range and \( Z(= \sum D_i^6) \) is the “radar reflectivity factor”, in which \( D_i \) is the diameter of the raindrop interference.

The rainfall rate (R) is estimated by using one of the empirical relationships that correlate Radar reflectivity and precipitation rate. These relationships have been derived largely based on measuring rainfall drop size as distributed in observed rainfall (Batton, 1973). These relationships take the form of the usual power law given by \( Z = AR^b \) where \( Z \) is expressed in \( \text{mm}^6 \text{m}^{-3} \) and \( R \) in \( \text{mm h}^{-1} \). The relationships that are currently being widely used are \( Z = 300 R^{1.4} \) (convective storms), \( Z = 200 R^{1.6} \) (general stratified precipitation), \( Z = 230 R^{1.4} \) (mixture of cellular and more widespread rain), \( Z = 400 R^{1.3} \) intense convective storms, \( Z = 100 R^{1.4} \) (non-cellular rain). It is noted that these widely used equations, although all being power law formulations, differ considerably from each other, not only in their exponent values, but also in their coefficients. Consequently, variations in the
precipitation event, over both time and across distance, as typically occurs, indicates potentially considerable differences in the outcomes of these equations in their predictions of precipitation.

2.2 Evaluation of WSR-88D Performance for estimating Rainfall
Over the last two decades, many researchers have compared the WSR-88D precipitation estimates with actual precipitation gage observations and measurements and some of their findings are summarized below. Mizzell (1999) compared the radar estimates of precipitation with measured values obtained from 62 standard rain gages and 10 tipping gauges, for storm events monitored in Lexington county in South Carolina. Her analysis examined 7 storms (1997-98 period) which spanned across a variety of storm types, such as convective storms, tropical systems, and stratiform events, showed that the radar data underestimates the precipitation, regardless of the storm type. The degree of underestimation varied with the intensity, type and duration of storm event. The deviation was highest for the stratified form and lower for convective storms. The limitations in radar to estimate accurate reflectivity due to hail, abundance of moisture in tropical maritime air, larger than average raindrop diameters and downdrafts were reasons for the underestimation. Data summarizing the performance details for the seven storms are shown in Table 2.

Table 2. Summary of rainfall comparison (Mizzell 1999)

<table>
<thead>
<tr>
<th>Storm date</th>
<th>Precipitation range of all gages (inches)</th>
<th>Radar precipitation range (inches)</th>
</tr>
</thead>
<tbody>
<tr>
<td>Sep 24-28, 1997</td>
<td>3.1-6.52</td>
<td>0-1.76</td>
</tr>
<tr>
<td>Oct 22-26, 1997</td>
<td>0.87-3.02</td>
<td>0.09-0.79</td>
</tr>
<tr>
<td>Jan 22-23, 1998</td>
<td>0.98-2.22</td>
<td>0.06-0.66</td>
</tr>
<tr>
<td>Feb 3-5, 1998</td>
<td>2.93-4.23</td>
<td>0.23-1.31</td>
</tr>
<tr>
<td>Apr 8-9, 1998</td>
<td>0.88-2.64</td>
<td>0.30-2.67</td>
</tr>
<tr>
<td>Aug 9, 1998</td>
<td>0.25-2.13</td>
<td>0.04-1.96</td>
</tr>
<tr>
<td>Sep 3-4, 1998</td>
<td>4.94-7.35</td>
<td>1.67-4.94</td>
</tr>
</tbody>
</table>

Skinner et al., (2009) compared radar and precipitation gage measurements for time period of 4 years in the Southwest Florida Water Management District. While that study focused on the Upper and Lower Kissimmee river rain areas, the radar performance was evaluated across different seasons. Their analysis shows that the radar values are lower by 5%, and the bias across the two data sets is present across all seasons The authors state that the chosen Z-R relationship for converting reflectivity to precipitation rate plays an important role in the accuracy of the radar derived precipitation values.

Baeck and Smith (1998) analyzed the radar rainfall values for five high flooding events, during the 1994-96 time period. While the radar underestimated the precipitation for four events, it overestimated the true value for one event (Table 3). The errors in radar that caused the deviation are noted as being caused by, (a) the Z-R relationship, which is a function of the raindrop diameter; (b) radar overshooting at short distance and undershooting at far range; (c) the presence of hail which can lead to overestimates. Since few storms have both heavy rainfall and
hail occurring at the same time and some other storms that have large hail and low rainfall rates, obtaining the correct reflectivity values from radar is a challenge.

Table 3. Details of the analyzed storms by Baeck and Smith (1998)

<table>
<thead>
<tr>
<th>Storm</th>
<th>Date</th>
<th>Storm type</th>
<th>Reliability of radar estimated precipitation values</th>
</tr>
</thead>
<tbody>
<tr>
<td>Rapidan storm, Rapidan River</td>
<td>27 June, 1995</td>
<td>Orographic</td>
<td>The radar precipitation estimates were low by a factor of approximately 3.</td>
</tr>
<tr>
<td>Dallas Hailstorm</td>
<td>5-6 May, 1995</td>
<td>Supercell thunder</td>
<td>The radar precipitation estimates were less than 70% of the mesonet rain gage observations</td>
</tr>
<tr>
<td>Southeast Texas storms</td>
<td>16-17 Oct 1994</td>
<td>Extratropical cyclone</td>
<td>The radar underestimated the precipitation values</td>
</tr>
<tr>
<td>Chicago storms</td>
<td>17-18 Jul 1996</td>
<td>MCS</td>
<td>The Chicago WSR-88D underestimated the heaviest rainfall by approximately 40% (at a range of approximately 50 km). The Davenport, Iowa radar data were in close agreement with rain gage observations at ranges beyond 150 km.</td>
</tr>
<tr>
<td>Hurricane Fran, Tar River</td>
<td>5-6 Sep 1995</td>
<td>Hurricane</td>
<td>Radar precipitation values were more than an order magnitude less than precipitation gage values</td>
</tr>
</tbody>
</table>

Klazura et al., (1999) compared the radar precipitation and precipitation gage values from 10 radar sites across 43 precipitation events. The events were classified into two categories; high reflectivity versus low reflectivity horizontal grade events. The accuracy of the radar values was tied to the precipitation category. While the radar significantly underestimated the precipitation data for low reflectivity events, it slightly overestimated the values for high reflectivity storms. For the former, the bias was more evident in short and long ranges. Possible reasons for the poor radar performance were reported to include anomalous propagation, inaccurate reflectivity values due to melting ice, bright band effects in stratified systems, presence of hail, and improper radar calibration.

Young and Brunsell (2008) compared the daily gage date for the Missouri River basin with the radar Stage III and multisensory precipitation estimates. The overall bias for NEXRAD data was –39 percent for the cold season and –32 percent for the warm season. The mean bias in the radar precipitation values was -38%, which is greater than the values reported in some other reports in the literature. Jayakrishnan et al., (2004) compared measured precipitation with WSR–88D Stage III data across 545 rain gages over the Texas-Gulf basin for the 1995 to 1999 time period. Their analysis showed the radar precipitation values underestimated the true precipitation values at most of the stations.

Smith et al., (1996) examined the issue of systematic bias by comparing the hourly precipitation derived values from radar gage data, across two radar sites for a 15 month time period starting from September 1991. They examined bias from three contexts and their data shows that their radar estimated precipitation values were inaccurate. Numerous issues were discussed with respect to biases relating to distance from the radar site. Range dependent bias was present for
most of the events leading to incorrect precipitation estimates. While the precipitation was underestimated at low ranges due to incorrect reflectivity values at higher elevation angles, it was overestimated at intermediate range due to bright band and anomalous propagation. At long ranges, the values were underestimated due to overshooting. Their analysis showed that the rain gage observations were 48% higher than radar estimates in the range 0-40 km, 18% in the range 40-160 km, and 40% in the range greater than 160 km for the warm season. For the cold season the corresponding values were 30%, 14%, and 100%.

2.3 Dual Polarization Radar
The advances made in better understanding the science behind precipitation events has led to the upgrading the WSR-88D radars to Dual Polarization Radars. The dual radar polarimetry allows for data quality enhancements and addresses some of the limitations reported with WSR-88D radar. While WSR-88D radar transmits and receives radio waves along a single horizontal polarization, Dual Polarization radars transmit and receive signals across both horizontal and vertical polarizations. The availability of reflected power and phase details along two directions enables calculating additional parameters (e.g., differential reflectivity, differential phase and correlation coefficient) which can then be used to arrive at improved precipitation estimates, and can better differentiate between heavy rain, hail, snow and sleet. The works of Zrnic and Ryzhkov, 1999; Doviak et al., 2000; Bringi and Chandrasekar, 2001; Vaccarono et al., 2016; provide more resources including precipitation equations relating to Dual Polarization or polarimetric radar.

3 Errors in Radar Estimated Precipitation Values
Villarini and Krajewski (2010) provide a detailed examination of some of the errors associated in radar estimated precipitation values. The authors grouped possible errors into nine factors. While these are listed below, further details of that research investigation and descriptions of the identified nine factors can be found in the cited reference. These factors are radar mis-calibration, pulse signal attenuation, anomalous propagation, beam blockage, Z-R relationship adopted, effect of range, stratification of precipitation, movement of air in the vertical direction, and data sampling errors. Hunter (1996) also presented an in-depth discussion of various precipitation estimation errors and consider possible potential remedies.

Krajewski et al., (2009) in their manuscript, “Radar-Rainfall Uncertainties: Where are We after Thirty Years of Effort?” quantified some of the uncertainties in radar precipitation estimates. Their analysis shows that although the radar estimates have improved over the last three decades, they noted that “Despite over 30 years of effort, the comprehensive characterization of uncertainty of radar-rainfall estimation has not been achieved”.

Berne and Krajewski (2013) in their paper, “Radar for hydrology: Unfulfilled promise or unrecognized potential? ” discussed some of the challenges for the use of weather radar in hydrology (i.e., validation studies, precipitation forecasting, mountainous precipitation, error propagation in hydrological models). They noted that using weather radar for precipitation measurements in mountainous regions is still a challenge, since ground clutter, beam shielding and large vertical variability strongly affect the accuracy of estimates and need to be treated properly.
In summary, the literature review shows that although it is true that Doppler radar has provided considerable increases in the understanding and assessment of storm precipitation and related weather phenomenon, these radar data and outcomes still require careful interpretation and further assessment in order to achieve a desired level of accuracy.

Recalling the title of the paper from the work of Berne and Krajewski (2013), “Radar for hydrology: Unfulfilled promise or unrecognized potential?” It is prudent, therefore, to continue data collection and conduct further assessment on the continuing evolving radar technology, but to carefully use these accumulating mountains of data with high levels of caution, with high attention to mathematical modeling computational error as well as collected and synthesized data measurement error.

4 Doppler Radar Assessment Update for the Arid Regions of the County of San Bernardino

4.1 Doppler Candidate Storms
A goal of this study is to leverage the Doppler data available for the SBC arid area and to develop correlations of the Doppler areal coverage to precipitation gage data that corresponds to the storm events analyzed with respect to the Doppler. These new correlations may be useful to refine similar relationships throughout the arid area of the SBC. The arid portion of San Bernardino County includes approximately 20,000 square miles of area, which are currently monitored by 77 precipitation gages with hourly or shorter duration data (excluding daily gauges). Based on the data from these 41 gauges, 156 storm dates with return frequencies estimated using the National Weather Service (“NWS”) to be greater than 10-year were identified as occurring between years 1997 and 2006. These candidate events were then forwarded to the Doppler analysis. [Based on the data from these 36 gauges, 55 storm dates with return frequencies greater than the NWS-estimated 10-yr levels were identified between years 2007 and 2015 as candidates for further Doppler analysis.]

4.2 NOAA NEXRAD Data Acquisition and Storm Animation
Since the arid region of San Bernardino County encompasses such a vast area, multiple radar Sites were analyzed for storm events. The Radar sites include: Yuma (KYUX), Edwards (KEYX), Santa Ana (KSOX), Las Vegas (KESX), and San Diego (KNKX). After the storms of interest were identified, the NOAA Radar (NEXRAD) data were obtained and downloaded off the NOAA website (www.ncdc.noaa.gov/nexradinv/) for each of the candidate storms. In particular, the LVL3-one-hour precipitation product was obtained. These files contained data in 5-minute intervals for the entire storm period. The LVL3-one-hour data summarizes 1-hour precipitation intensity by assigning the estimated precipitation amounts to a 2km by 2km grid. When the data are exported to a geographic information system (GIS), the 2km by 2km grids are further broken down into 0.086 mile by 0.086 mile grids (oriented to true north). Each of these refined grid points are assigned the original value based on the initial 2km by 2km grid. When the data are animated using NOAA’s NCDC Java NEXRAD Viewer and Data Exporter [currently known as the NOAA Weather and Climate Toolkit], an estimated intensity of precipitation can be seen as a storm moves across a region, much like the Doppler tracking commonly used in television weather and news broadcasts. For each of the candidate storms, three days of data were obtained (when available). By including data for the day before the candidate storm, and the day after the candidate storm (target date of interest occurring in the
middle), a more complete picture of the storm event is rendered even if it begins in the evening of the previous day or continued through the night into the following day.

### 4.3 Analysis of Doppler Animation and Peak Durations

Using the techniques described above, a Doppler animation was created for the 156 [50 candidate 2007-2015] candidate storm events that have available data (Figure 2). From these animations, the 3-hr, 2-hr, 1-hr, 30-minute and 15-minute peak rainfall peak durations were identified. Based on the intensities for each target peak duration interval, the most significant storms (Figure 3) were identified for further analysis.

**Figure 2.** Analyzed storm locations during 1997-2015 period

### 4.4 Assessment of Doppler Storm Events

Some storms were eliminated from further consideration for one of the following reasons; (a) no Radar data available for the date (b) available Radar data was corrupt (c) no storm appeared on the Radar as being recorded at the rain gauges (d) the storm was not a top-ranking storm and (e) if same storm was measured on multiple Radar sites, the site with the best coverage was selected.

### 4.5 Import Radar data into GIS

4.5.1 1997-2006 DOPPLER data

By applying this criteria to the SBC area storm events, a total of 14 candidate storms were selected as being significant; however, two candidate storms were eliminated because of questionable data. The 12 remaining significant storms (Figure 3) were examined at the peak 3-hour, 2-hour, 1-hour, 30-minute, and 15-minute durations. The original raw Doppler data for
these intervals were then exported for analysis. The 5-minute Doppler files for the target key durations were exported as an ASCII grid file by the NEXRAD Viewer and Data Exported to be imported into GIS. Prior to being imported into GIS, the 5-minute 1-hr intensity files were converted to accumulated depths for the peak intervals of interest (3-hr, 2-hr, 1-hr, 30-minute and 15-minute) using a scripted routine that calculated the accumulations from the 5-minute files. This was done by summing the ACSII grid files for each duration.

Figure 3. Key storm event radar aerial coverage locations

4.5.2 2007-2015 data assessment
The same criteria as described above was applied, however, due to the recent upgrades to the NOAA Weather and Climate Toolkit, a few processing steps were bypassed. The toolkit currently has the capabilities of converting the 5-minute 1-hr intensity files into accumulated depths for the peak intervals (3-hr, 2-hr, 1-hr, 30-minute and 15-minute), the output summation was then imported into GIS.

The accumulation grid files of the target peak durations for the said significant storms were then imported into GIS in order to locate the isolated storm cells and identify their areas of influence on a map.

4.6 Preparation of Correlation between Doppler Estimated Precipitation versus Doppler Depicted Aerial Extent of Precipitation

After exporting the Doppler data from GIS into Excel as ASCII point files, area averaged depths were calculated for each target peak duration. The imported ASCII point files contained three values (the centroid X-coordinate, the centroid Y-coordinate and an estimated precipitation depth
value from NWS algorithms); however, the X- and Y-coordinates were not required for precipitation depth analysis. The estimated precipitation distribution depths were partitioned into intervals such that the number of instances with depth values greater than 0.1, greater than 0.2, greater than 0.3, and so forth, were recorded (using increasing increments of 0.1). This procedure continued until the maximum estimated precipitation depth value is reached. The number of instances for each partial value was then multiplied by a conversion scaling factor to derive an associated area in square miles (cell size). Using these values, an average normalized estimated precipitation depth for each target peak interval is calculated and the area extent versus estimated average precipitation depth for a given interval may be plotted in computer program EXCEL (Figure 4).

![Figure 4. Comparison of Depth Area Reduction Factor for Key Storms (the storm details are listed in Table 4)](image)

4.7 Comparison of Radar to Precipitation Correlations to Published Rainfall Depth-Area Curves

To assess comparability between the derived Doppler vs estimated Precipitation correlation curves for the examined analyzed storm events, these Doppler vs Precipitation correlation curves were compared to the Depth-Area Adjustment Factor (“DARF”) curves developed and published
The DARF curves published in the San Bernardino County’s 1983 and 1986 Hydrology Manuals are based upon severe storm data including the Los Angeles area 1943 Sierra-Madre storm event as assessed by the US Army Corps of Engineers Los Angeles District office (USACOE). In comparison, the Riverside County Flood Control District (RCFCD) DARF curves are based upon the NOAA Atlas 2 that was published in year 1973. The RCFCD curves were originally published by the US Weather Bureau in year 1957, and are based on storm events that occurred in IL, IA, MO, NJ, NY, SC, and AL (for example, see US Weather Bureau, TP29, 1957).

Other similar DARF relationships are available in the published literature and can be collected for comparison among other purposes. Such adjustment relationships were compared from the following agencies:

- Nevada Department of Transpiration (NVDOT); Vieux (2015)
- Riverside County Hydrology Manual (NOAA Atlas 2); Bryant (1978)
- Clark County Regional Flood Control District (CCRFCD, 1999)
- Truckee Meadows Regional Drainage Manual (TMRDM, 2009)
- Maricopa County Hydrology Manual (MCHD, 2016)
- Arizona Department of Water Resources (ADWR, 2017)

A comparison of DARF values are shown in Table 4, and Figures 5 through Figure 7, below, from the several considered agencies and from several of more significant storm events analyzed in the current study. It is noted that in the display of peak one-hour precipitation event data that arid severe storm events tend to have peak durations of approximately one hour.

### Table 4. Comparison of 1-hour Peak Duration Precipitation Depth-Area Reduction Factors

<table>
<thead>
<tr>
<th>1H Comparison*</th>
<th>50 mi²</th>
<th>100 mi²</th>
</tr>
</thead>
<tbody>
<tr>
<td>8/25/2013 (KNX)</td>
<td>0.99</td>
<td>0.89</td>
</tr>
<tr>
<td>9/7/2014 (KESX)</td>
<td>0.87</td>
<td>0.78</td>
</tr>
<tr>
<td>8/25/2013 (KSOX)</td>
<td>0.84</td>
<td>0.63</td>
</tr>
<tr>
<td>4/13/2012 (KEYX)</td>
<td>0.83</td>
<td>0.73</td>
</tr>
<tr>
<td>8/25/2013 (KYUX - La Quinta Storm 1)</td>
<td>0.82</td>
<td>0.73</td>
</tr>
<tr>
<td>8/13/2004 (KESX)</td>
<td>0.80</td>
<td>0.65</td>
</tr>
<tr>
<td>Riverside County Manual (NOAA Atlas 2)</td>
<td>0.80</td>
<td>0.73</td>
</tr>
<tr>
<td>9/19/2004 (KESX)</td>
<td>0.79</td>
<td>0.73</td>
</tr>
<tr>
<td>9/8/2014 (KYUX - La Quinta Storm 2)</td>
<td>0.78</td>
<td>0.61</td>
</tr>
<tr>
<td>9/11/2004 (KESX)</td>
<td>0.71</td>
<td>0.53</td>
</tr>
<tr>
<td>Nevada 90% DOT (Vieux)</td>
<td>0.68</td>
<td>0.55</td>
</tr>
<tr>
<td>10/15/2015 (KEYX-Palmdale)</td>
<td>0.61</td>
<td>0.46</td>
</tr>
<tr>
<td>12/22/2010 (KSOX-Highland)</td>
<td>0.51</td>
<td>0.42</td>
</tr>
<tr>
<td>San Bernardino County Depth Area Curve</td>
<td>0.50</td>
<td>0.40</td>
</tr>
</tbody>
</table>

*The data is identified by the storm date and the radar site (KNX – Sa Diego, KESX – Las Vegas, KSOX – Santa Ana, KYUX – Yuma, KEYX - Edwards)
Figure 5. Comparison of 1 hour DARF curves
Figure 6. Comparison of 6 hour DARF curves
4.8 Stand-Out Arid Area Storms

The La Quinta area of Southern California was subjected to two severe storms in successive years. Each storm was of remarkable rainfall intensity over approximately one hour durations. The second storm occurred in year 2014 with the first occurring in year 2013. Both storms caused significant flood damages, with the 2014 event being more severe and consequently, is displayed in the current paper. These are identified as La Quinta storm 1 (8/25/2013) and La Quinta storm 2 (9/8/2014) and briefly detailed below.

4.8.1 La Quinta storm 1 details (Tropical Storm IVO)

The remnants of Tropical Storm Ivo (8/25/2013) brought an influx of moisture into Southern California which resulted in heavy rainfall and flash flooding in the deserts of San Bernardino Riverside County. In the city of La Quinta more than 2.0 inches fell in a short period of time.

4.8.2 La Quinta storm 2 details (Hurricane Norbert Storm)

Hurricane Norbert (September 06, 2014) formed of the coast of south-central Mexico and moved northwesterly along Baja California where moisture from its remnants was pulled north (Figures 8,9). The remnants of the hurricane brought significant moisture to the southern portion of California, Nevada and Arizona. The circulation of Norbert along with the remnants of Atlantic Tropical Storm Dolly, spread moisture across northwest Mexico and into the southwestern United States (NOAA, 2014a). Eight to eleven storm cells began to form in the Coachella
valley, the migration propagated easterly to the Las Vegas area and then to Phoenix Area. Significant Rainfall occurred in Palm Springs and La Quinta Area. In Arizona 6.09 inches occurred near Chandler. At Phoenix Sky Harbor Airport during a seven-hour period 3.30 inches of rainfall occurred. It was also the largest daily rainfall in a single calendar day since records began in 1895 (NOAA, 2014b). Approximately a third of Maricopa’s County rain gauges set all-time records.

**Figure 8.** Path of Hurricane Nobert
Conclusions and Recommendations for Further Research

In this study, the assembly and resolution of the many DOPPLER arid hydrology storm events has resulted in valuable information for use now and far into the future. Observed in this effort are at least two "stand-out" arid area storm events of particular interest. Namely, the years 2013 and 2014 storm events that are well documented in the La Quinta area, of Riverside County California. These particular storm events moved through the City of La Quinta area and also impacted the highly urbanized areas of Phoenix, Arizona and also Las Vegas, Nevada, among other arid areas (See Figure 9). These two large cities are the homes of the highly respected hydrometeorological monitoring and assessment Groups in the Maricopa County Flood Control District, and also the Clark County Flood Control District, respectively. A more recent storm event in October 2015 that delivered a remarkably high return frequency one hour precipitation event occurred in the Palm Desert area of the Los Angeles County Flood Control District. These Agencies published very high return frequency estimates for the subject 2013 and 2014 events of up to 900-year return frequency.

The comparison of the Doppler data based peak duration estimates versus estimated precipitation aerial extent, both variables estimated by the algorithms integrated into the NWS available information, and subsequent comparison with the published DARF curves in the relevant flood control agency Hydrology Manuals cited, suggests that an underlying correlation may exist.
However, at this time, more data are needed to pursue this hypothesis, and therefore, such a conclusion would be premature.

6 Note from the Funding Agency
The County of San Bernardino Flood Control District’s participation in the funding of this research was an academic exercise to understand the relationship between radar data and rainfall rates and must not be used for design considerations in the County of San Bernardino. The District has embarked on an aggressive program to install more rain gages in the arid regions of the County of San Bernardino which will provide more localized rainfall data for a future research project.

References


Seene K. 2013. Flash Floods: Forecasting and Warning; Springer.


