

# **Estimating Maximum Aircraft Icing Environments Using a Large Data Base of In-Situ Observations**

## **AIAA 2006-0266**

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Cloud Physics and Severe Weather Research Section



Environment Canada  
Environnement Canada

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# Outline



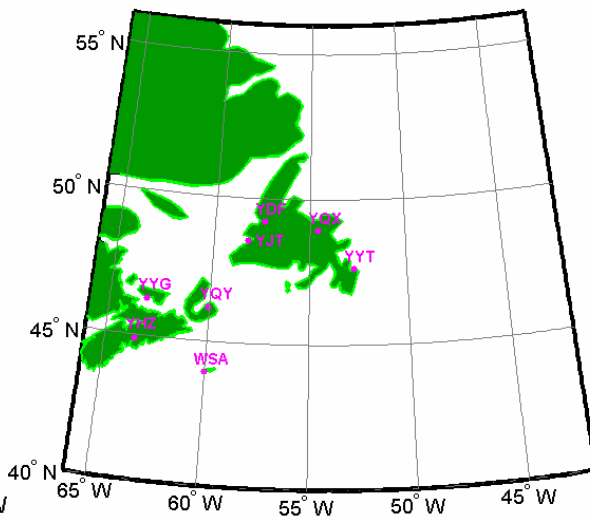
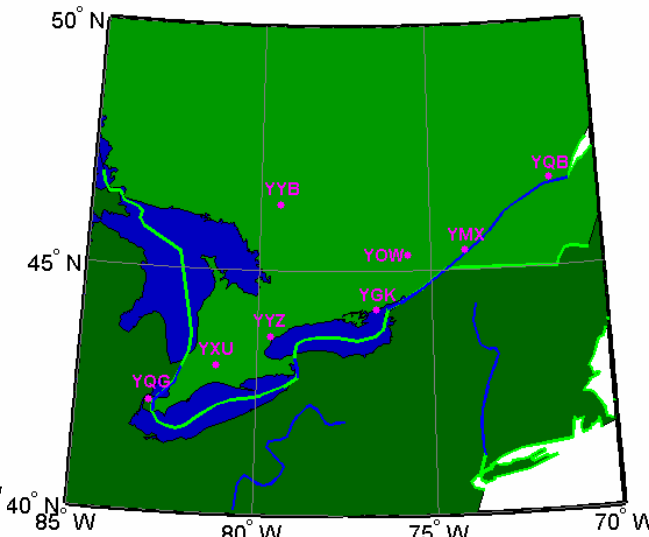
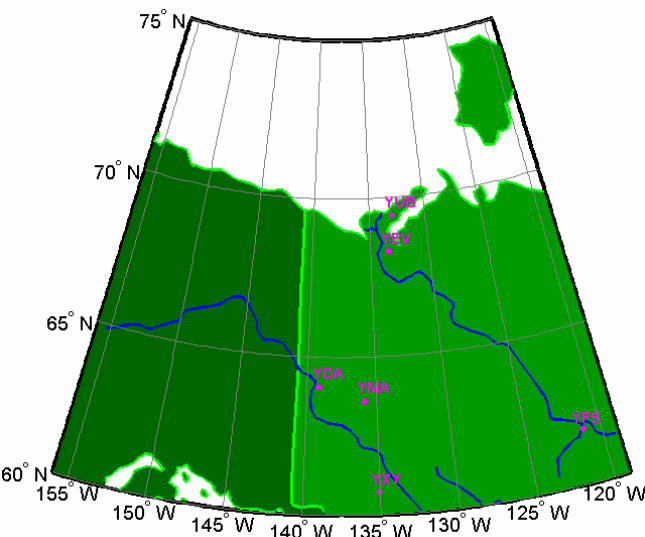
- Overview of the Data
- Extreme Value Analysis
- LWC Analysis for Environments with drops  $< 100 \mu\text{m}$
- LWC Analysis for SLD Environments
- Analysis of Scale Factors
- Conclusions

# Overview of the Data

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# Field Projects Used For This Analysis

• CFDE I	27 Feb 1995 - 24 Mar 1995	12 Flights
• CFDE III	10 Dec 1997 - 18 Feb 1998	26 Flights
• FIRE.ACE	01 Apr 1998 - 29 Apr 1998	18 Flights
• AIRS I	02 Dec 1999 - 19 Feb 2000	25 Flights
• AIRS I TO	02 Dec 1999 - 17 Dec 1999	16 Flights
• NASA SLD	15 Jan 1997 - 27 Feb 1998	37 Flights



# Research Aircraft

NRC

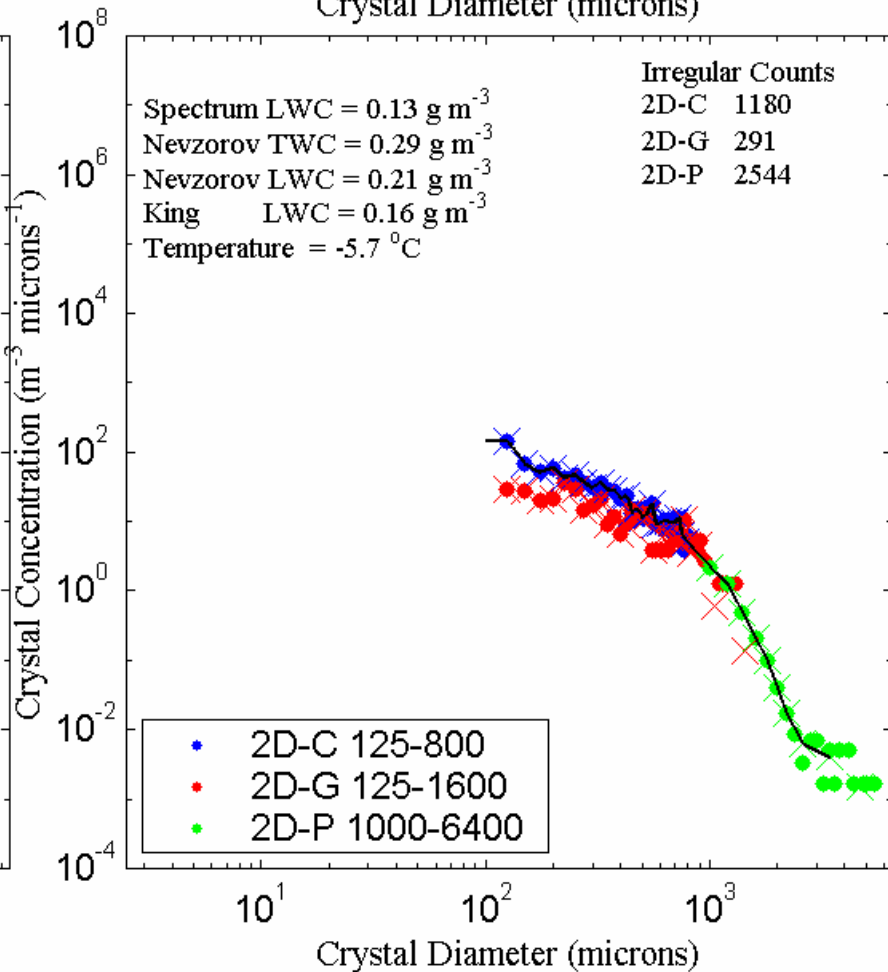
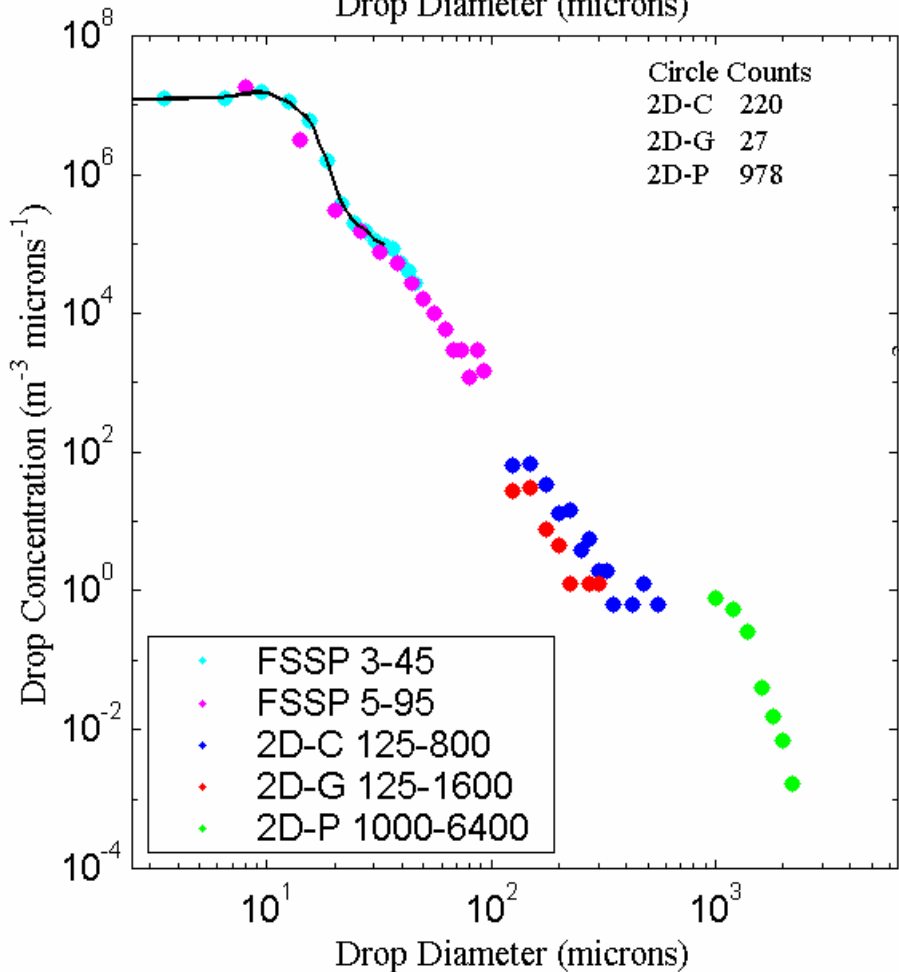
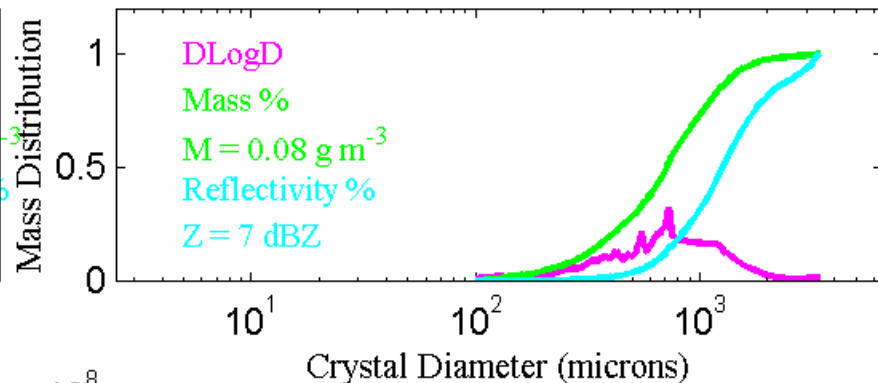
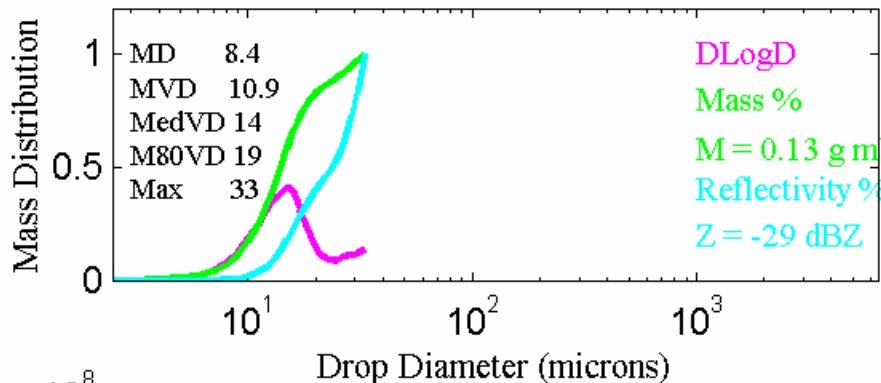
Convair-580



NASA-Glenn

Twin Otter





# Data Point Summary

Definition	30-s Points	Characteristics
In-Flight	48301	3 km Observations
In-Cloud	27497 (57%)	TWC > 0.005 g m <sup>-3</sup>
In-Cloud Cold	22263 (46%)	+ Ta ≤ 0°C
In-Icing	14199 (29%)	+ L/M Phase
In-Spectra	9808 (20%)	+ Ice ≤ 1 L <sup>-1</sup>
In-SLD	2444 (5%)	+ Dmax ≥ 100 μm

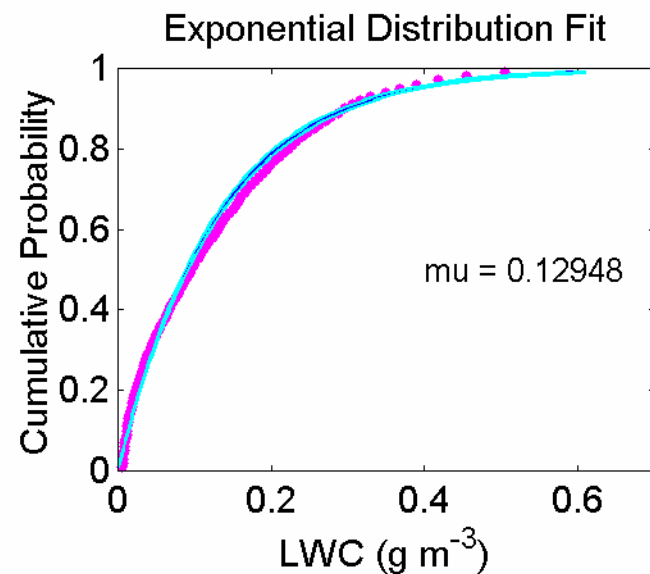
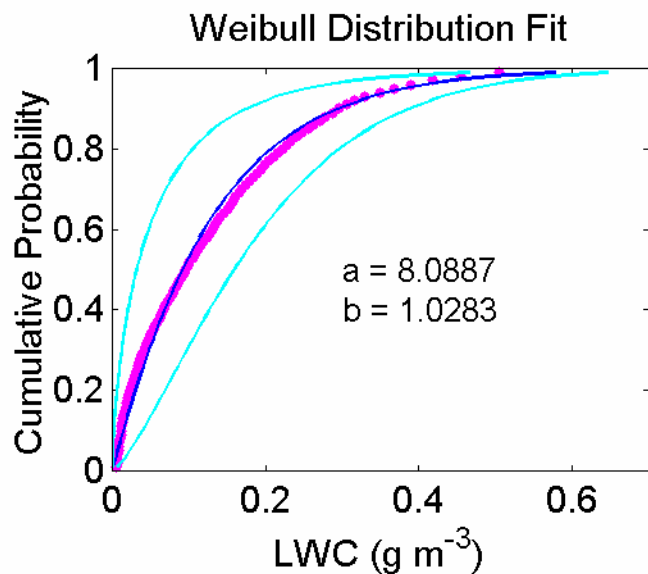
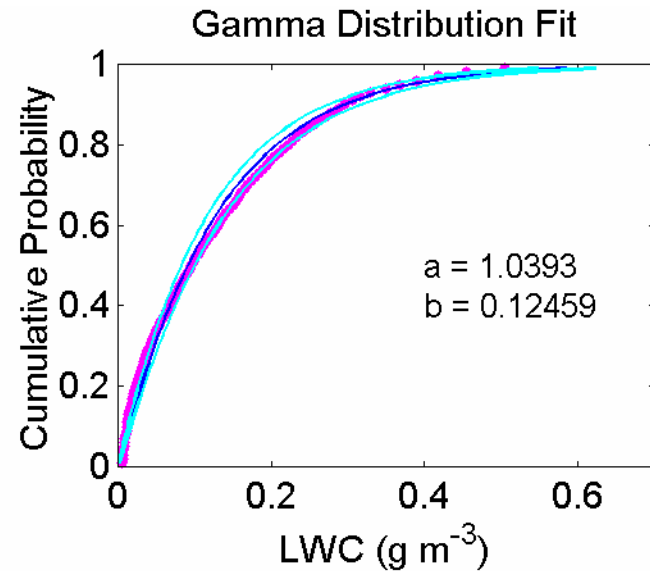
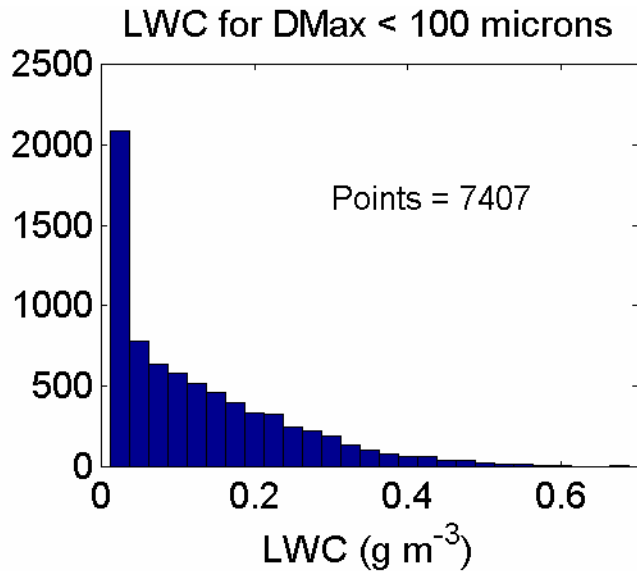
# Subsets of the Data

Environment	MVD	Dmax	Points
Small Drops	$< 40 \mu\text{m}$	$< 100 \mu\text{m}$	7364
ZLE	$< 40 \mu\text{m}$	100-500 $\mu\text{m}$	1469
ZLE	$> 40 \mu\text{m}$	100-500 $\mu\text{m}$	335
ZRE	$< 40 \mu\text{m}$	$> 500 \mu\text{m}$	193
ZRE	$> 40 \mu\text{m}$	$> 500 \mu\text{m}$	447

# Extreme Value Analysis

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# Fitting a LWC Distribution



# Extreme Value Analysis

- Three types theorem: there are only three types of distribution which can arise as limiting distributions of extremes in random samples.
- Generalized Extreme Value Distribution

$$P = \exp\left[-\left(1 + \xi \frac{x - \mu}{\psi}\right)^{-1/\xi}\right]$$

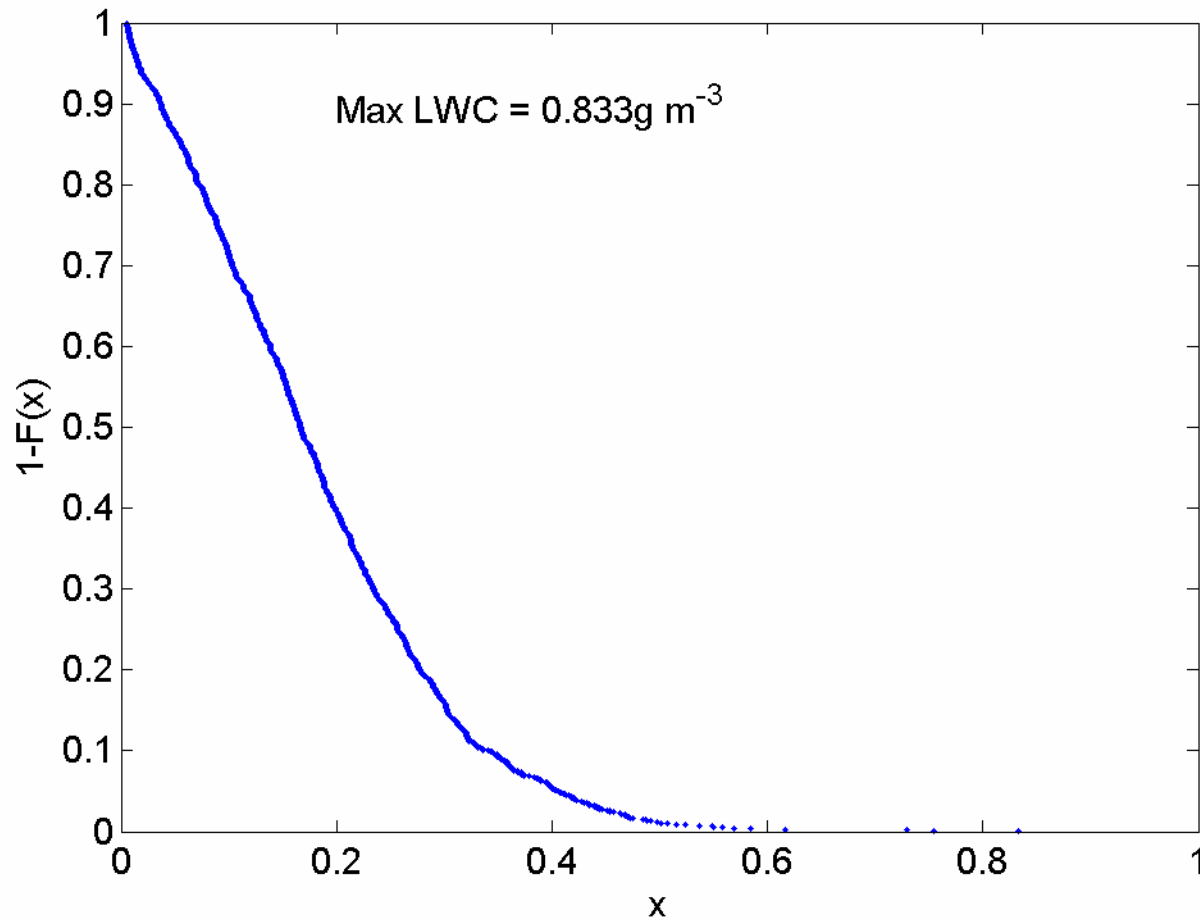
$\mu$  = location parameter

$\psi$  = scale parameter

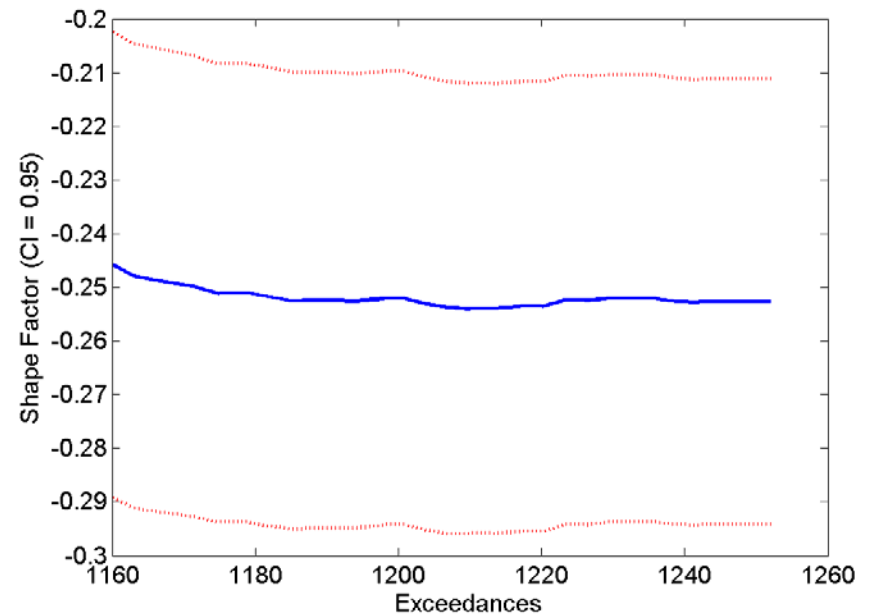
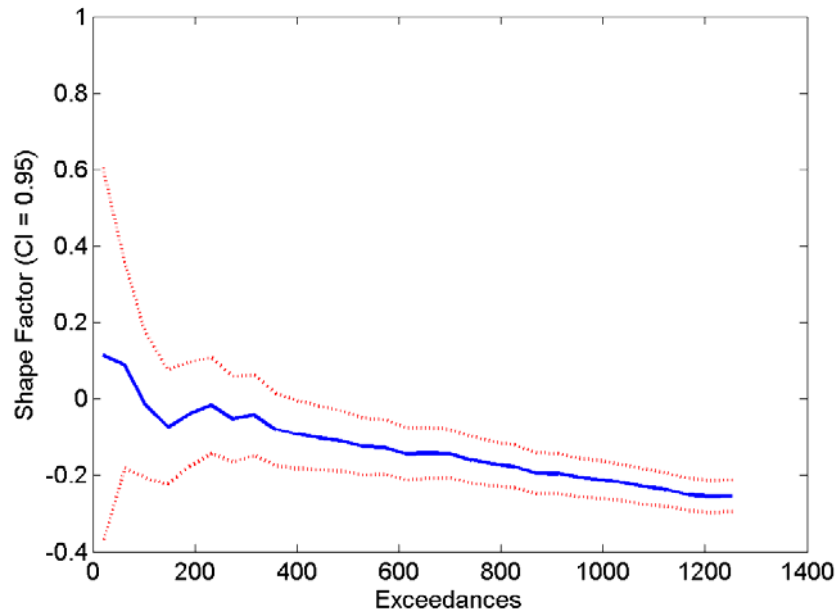
$\xi$  = shape parameter

- $\xi > 0$  Fréchet family     $P \sim \exp[-x^{-\alpha}]$      $\alpha = 1/\xi$     (long tail)
- $\xi < 0$  Weibull family     $P \sim \exp[-(-x^\alpha)]$      $\alpha = -1/\xi$     (short tail)
- $\xi = 0$  Gumbel family     $P \sim \exp[-e^{-x}]$     (medium tail)

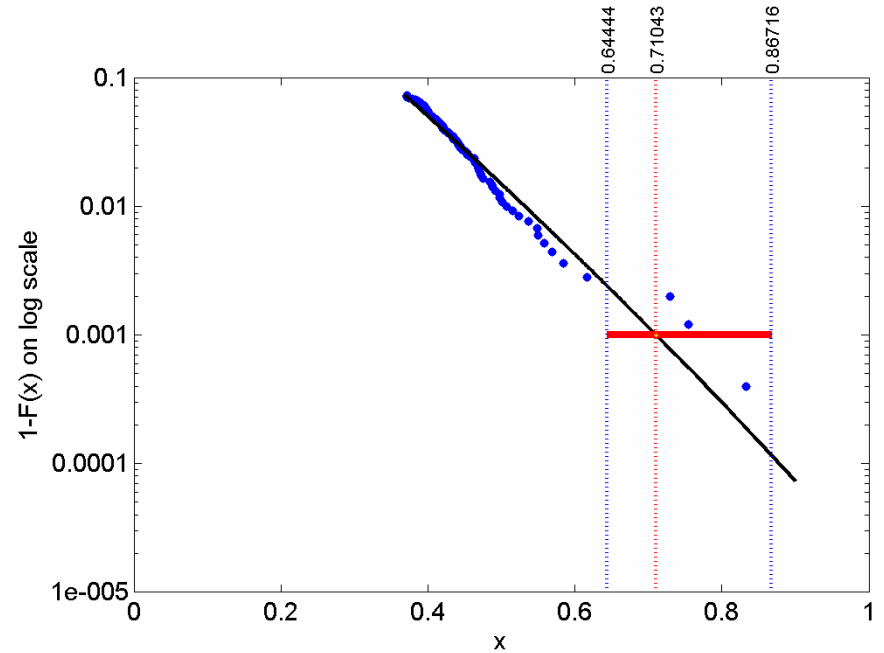
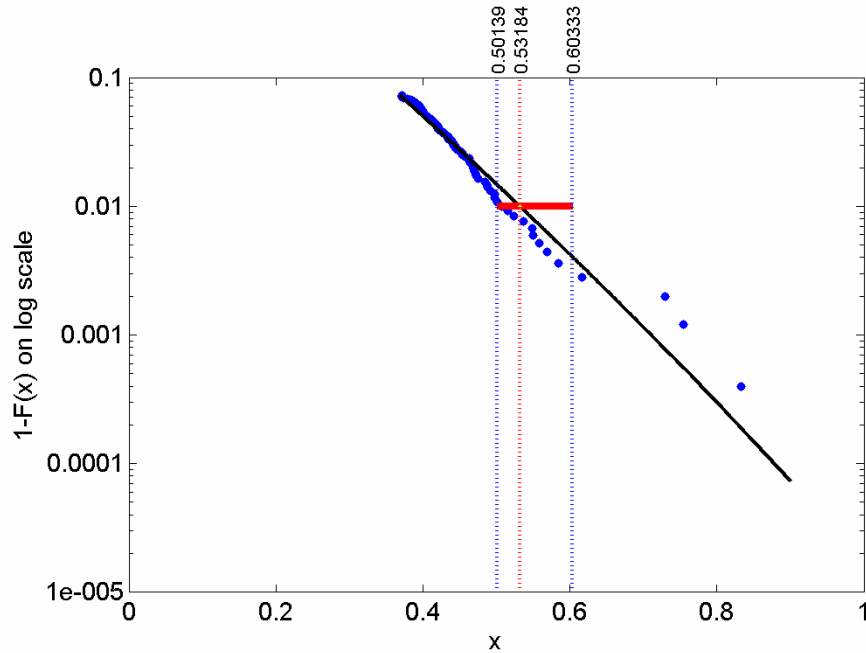
# Empirical Distribution of LWC




# Identify Threshold for Tail



# Fit the Tail to a Generalized Pareto Distribution

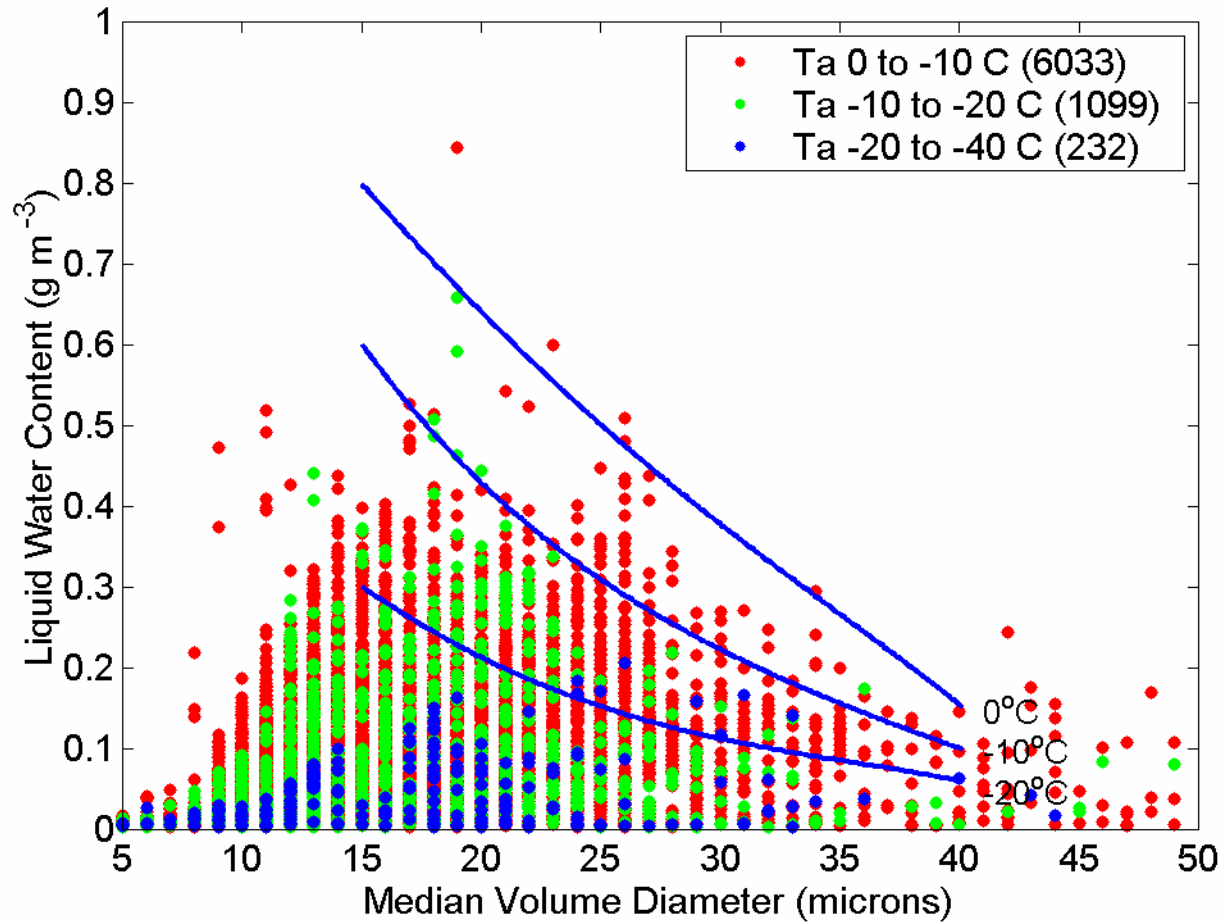


An aerial photograph of a vast, flat, white landscape, likely a salt flat or a frozen body of water, under a clear blue sky with scattered white clouds. The horizon is visible in the distance.

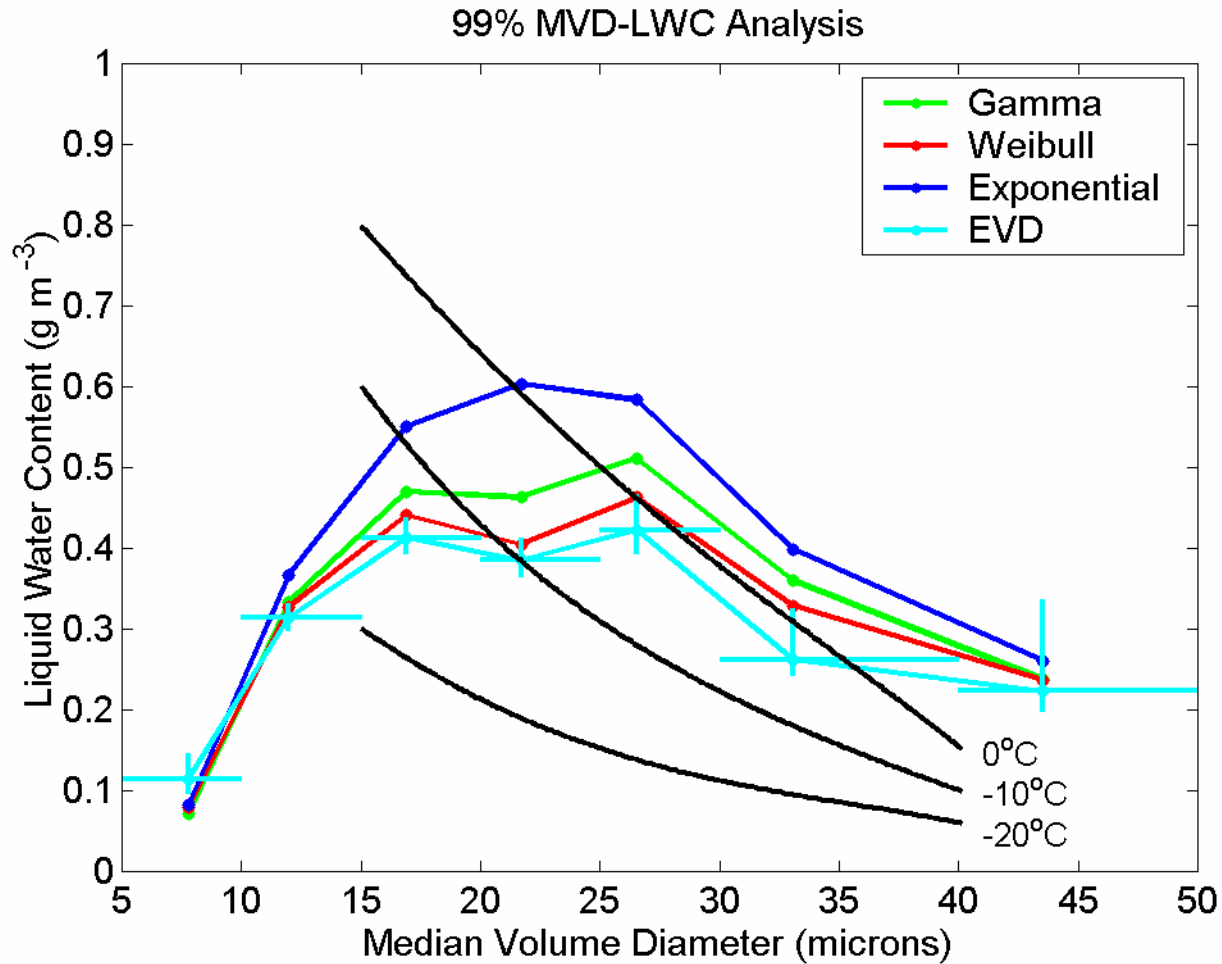
**LWC Analysis for Environments  
With Drops  $< 100 \mu\text{m}$**

13 12:03

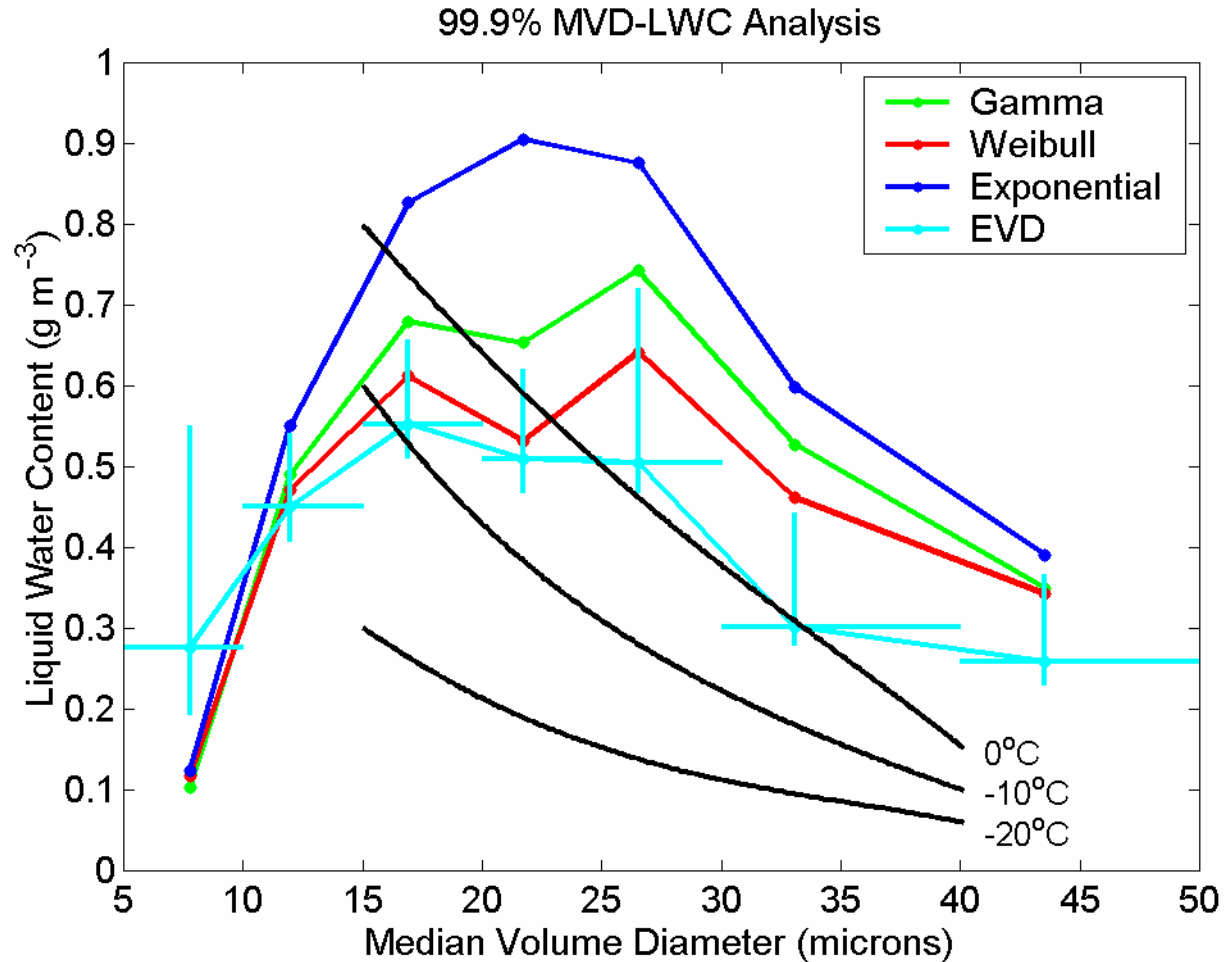
# Comparison With FAR 25-C




# 99% LWC Environments



# 99.9% LWC Environments

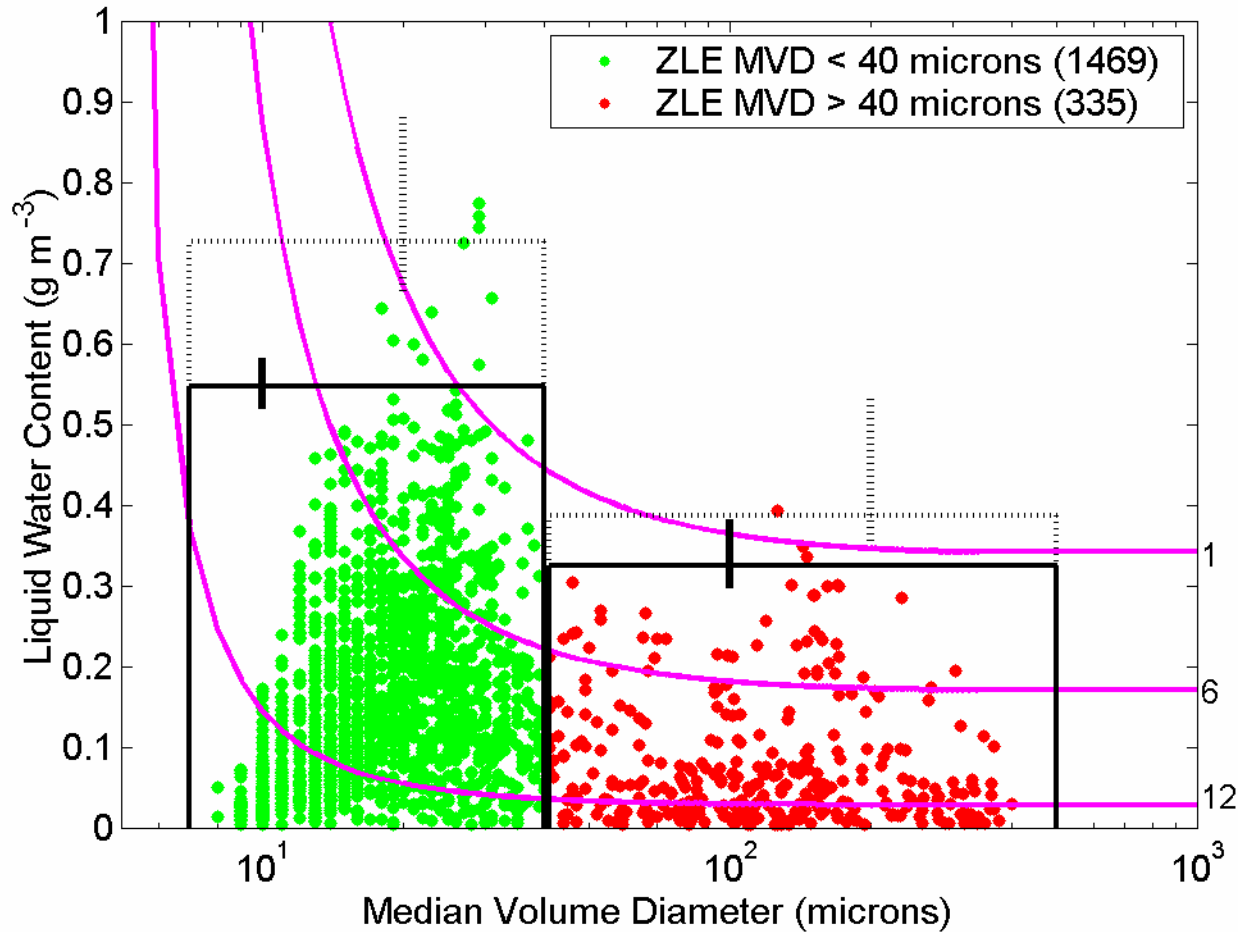


The background of the slide is an aerial photograph of a vast, flat landscape, likely a salt flat or a desert. The terrain is a mix of light and dark patches, suggesting different mineral compositions or perhaps a thin layer of water reflecting the sky. The sky is a pale, hazy blue, and a bright sun is visible in the upper right corner, creating a lens flare effect. The overall tone is bright and somewhat desaturated.

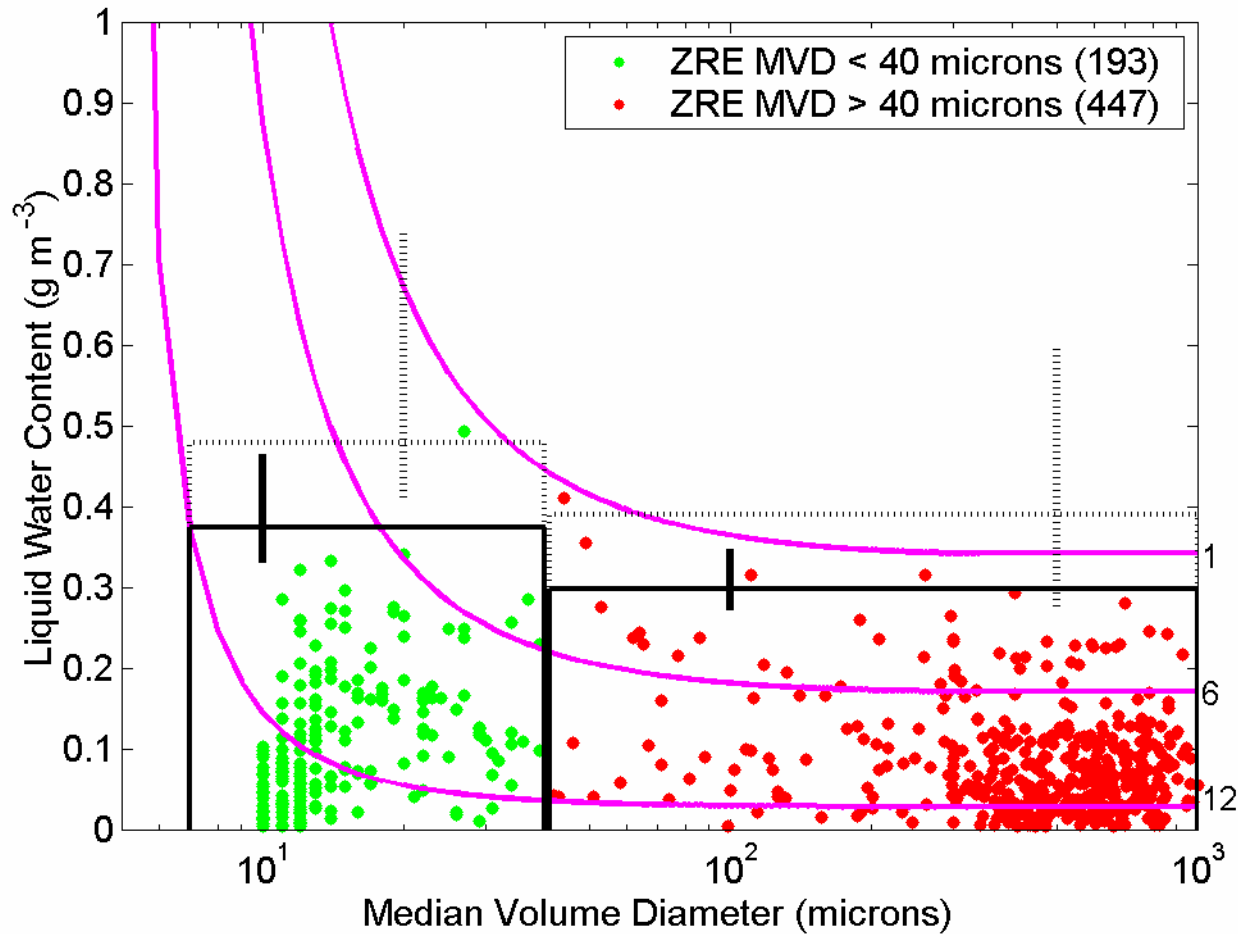
# **LWC Analysis for SLD Environments**

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# LWC Analysis for SLD Environments with ZL

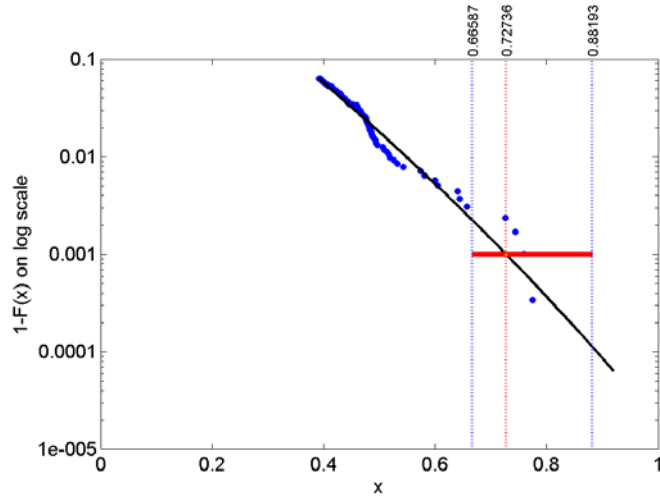


# LWC Analysis for SLD Environments with ZR

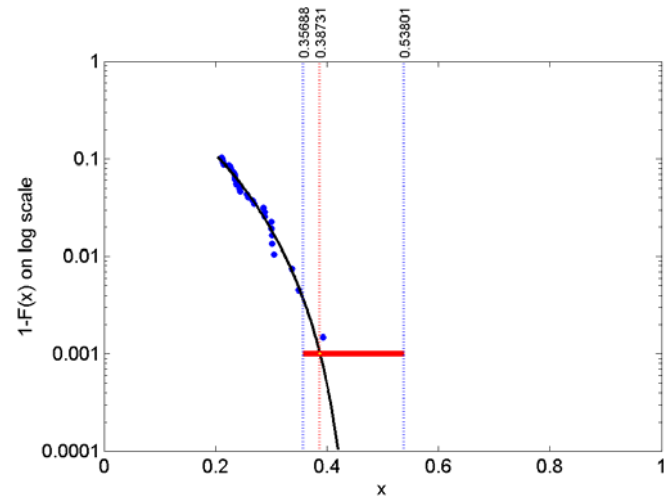


# SLD Distribution Tail Fits

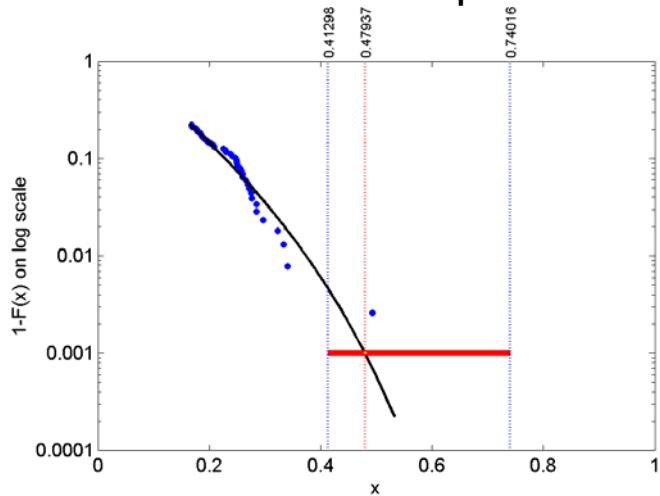
ZLE MVD < 40  $\mu\text{m}$



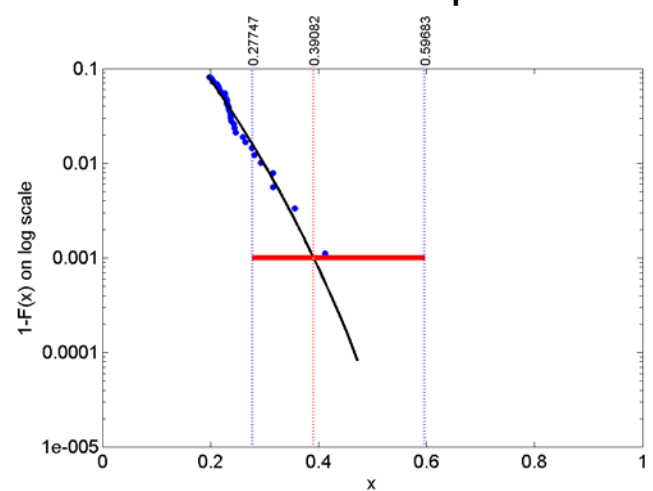
ZLE MVD > 40  $\mu\text{m}$



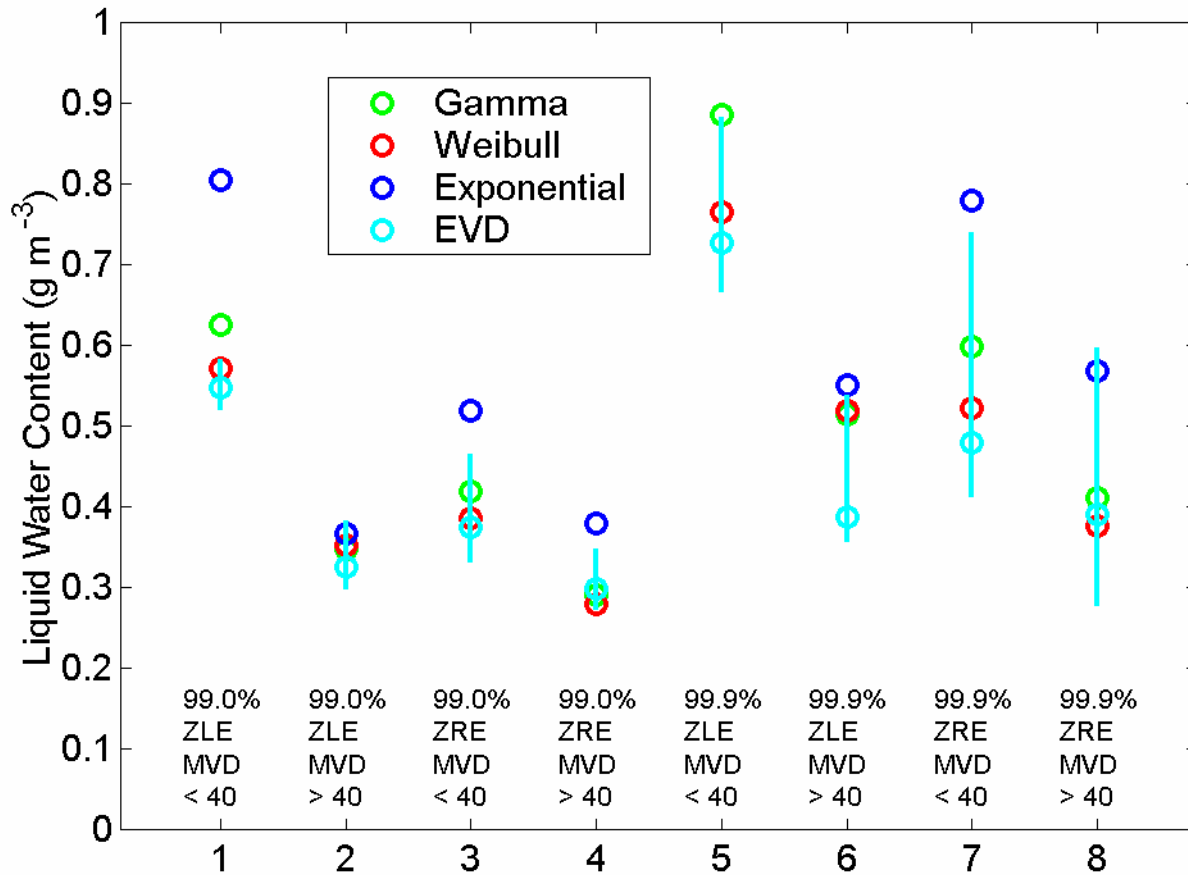
ZRE MVD < 40  $\mu\text{m}$



ZRE MVD > 40  $\mu\text{m}$



# Fit Comparison for SLD LWC

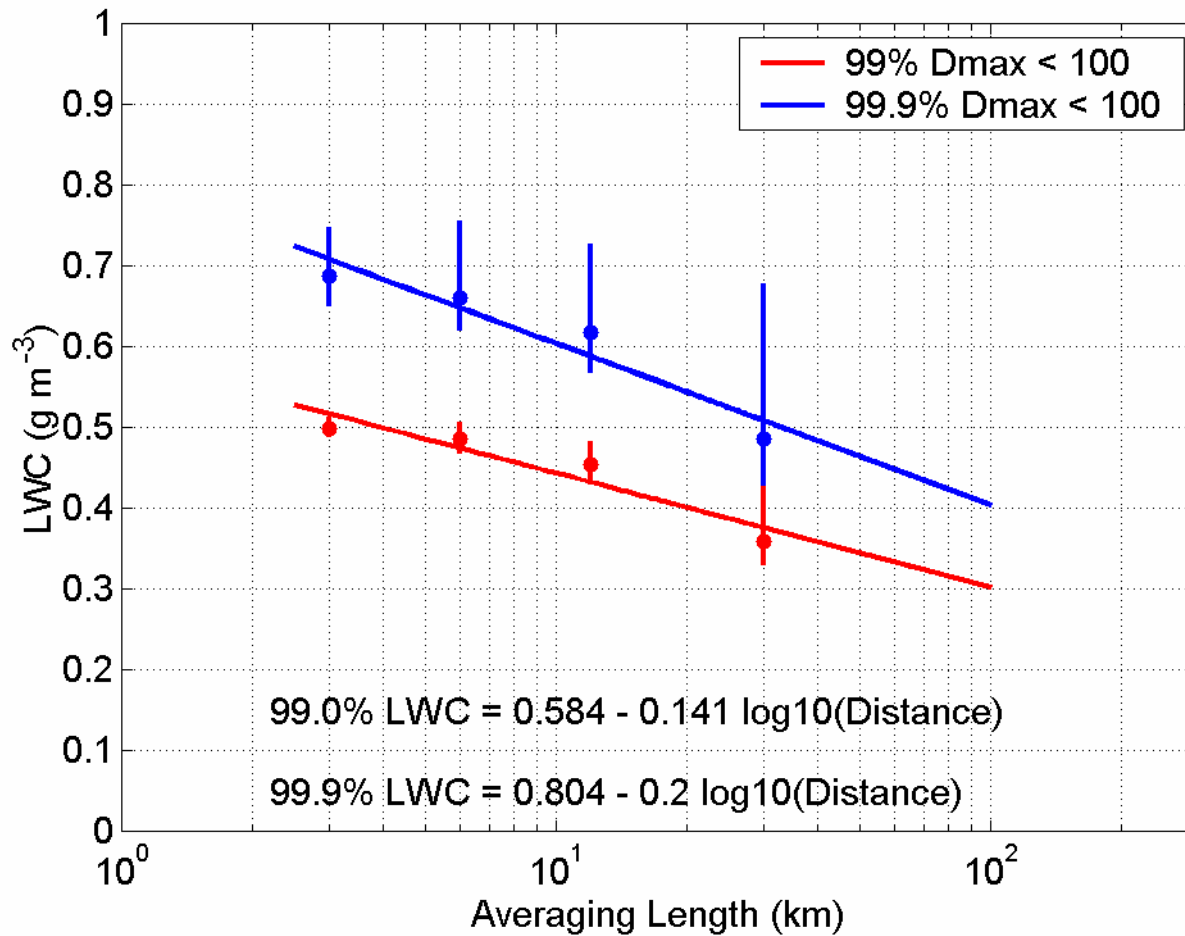


An aerial photograph showing a vast, flat, white landscape, likely a salt flat or a snow-covered plain, extending to a distant horizon. The sky is a deep blue with scattered, light-colored clouds. The overall scene is bright and expansive.

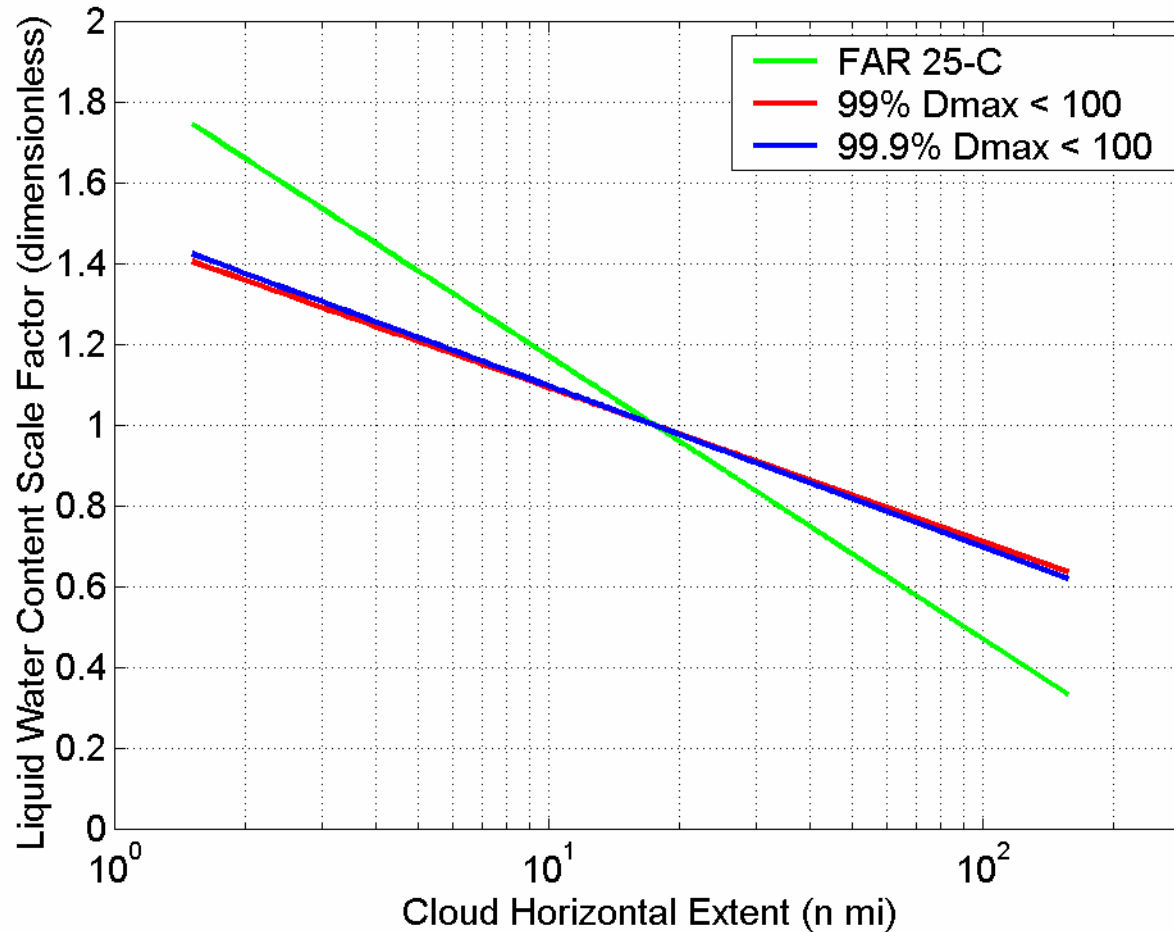
# Scale Factors

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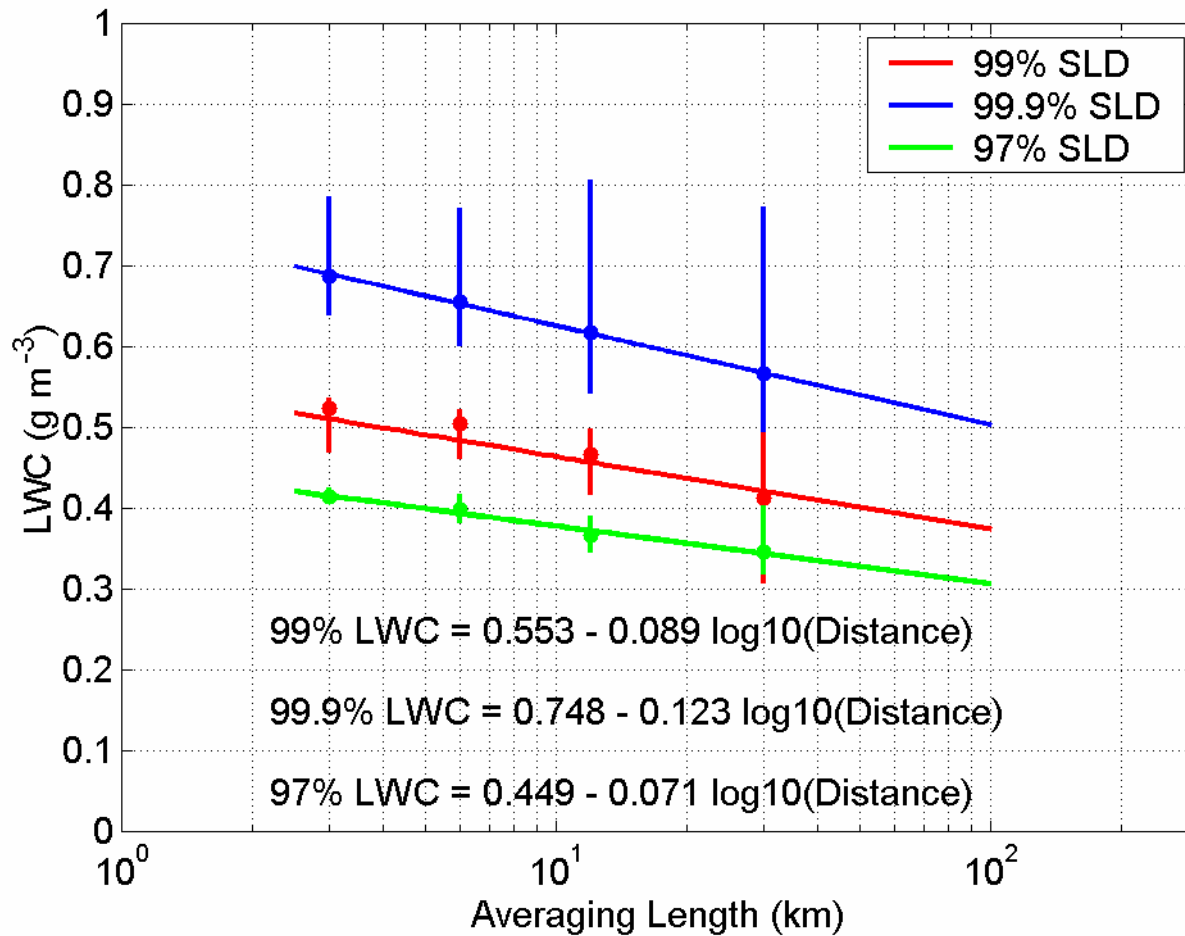
# Scale Factor for Small Drop Environments



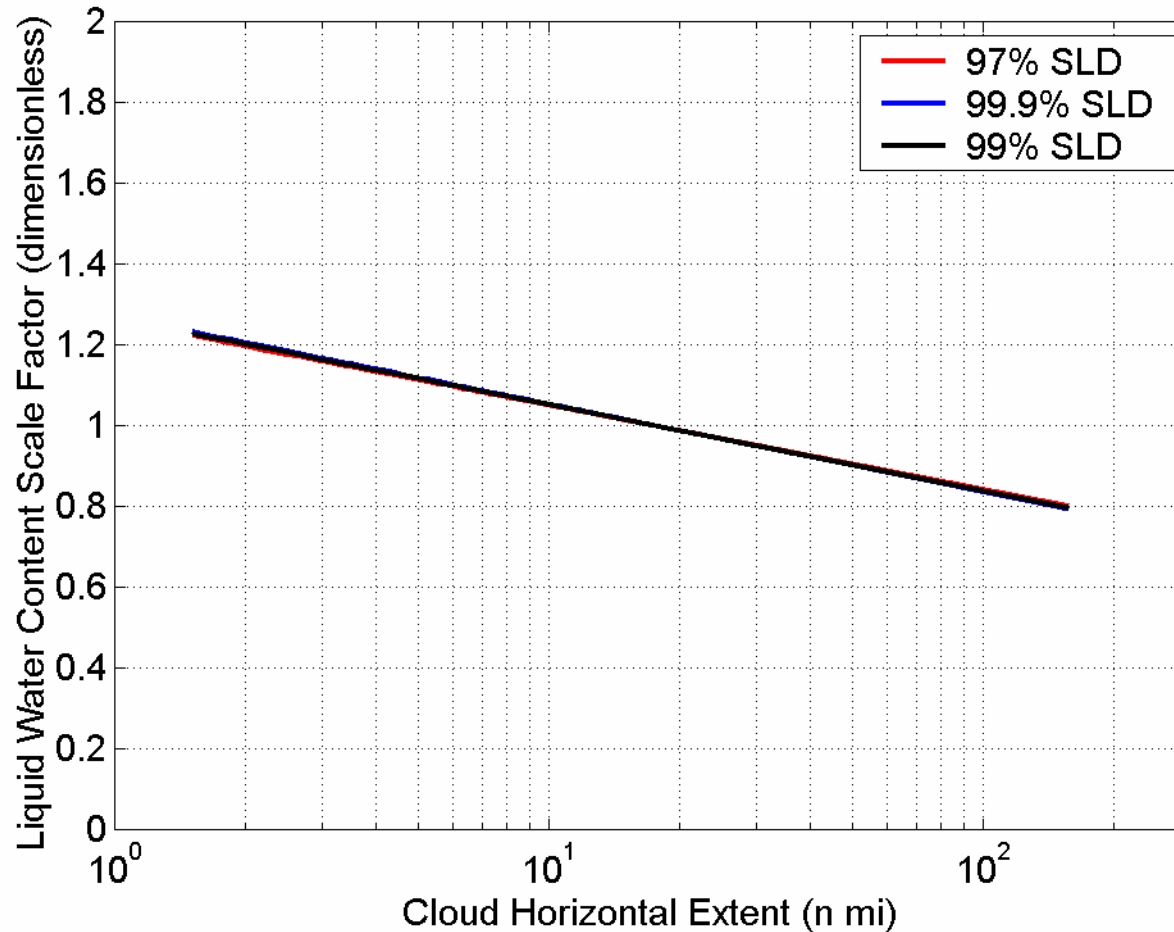
# Dimensionless Scale Factor Comparison



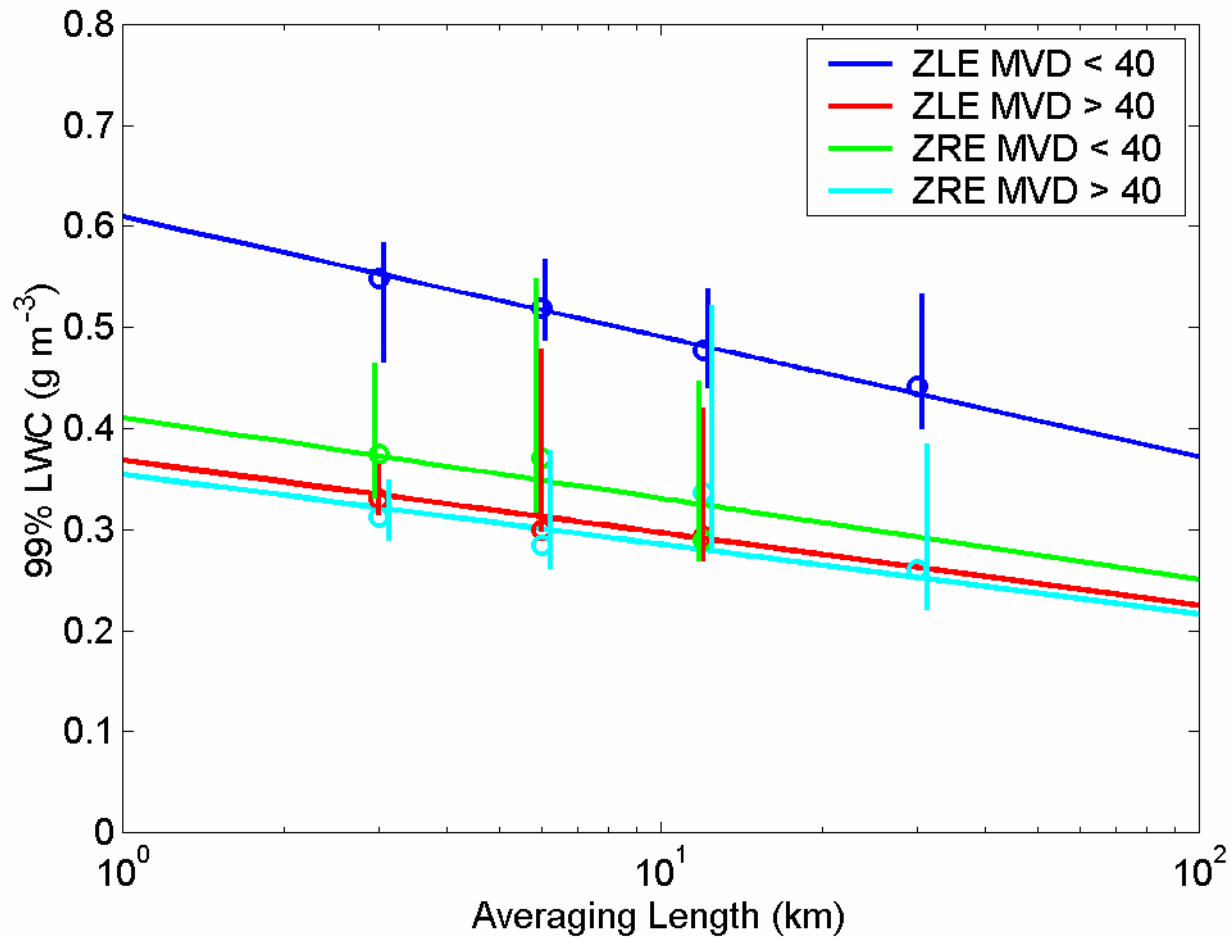
# Scale Factors for SLD Environments



# Dimensionless Scale Factor Comparison



# Scale Factor for Each SLD Environment



# Conclusions

1. For icing conditions with drops  $< 100 \mu\text{m}$  in diameter, the 99.9% LWC values derived using extreme value analysis techniques are consistent with the FAR 25-C 99.9% envelopes for continuous maximum icing conditions for MVD values in the range 20-35  $\mu\text{m}$ .
2. When the icing conditions with drops  $< 100 \mu\text{m}$  in diameter are fitted to an exponential distribution, the dimensionless scale factor derived for computing horizontal extent agrees with the FAR 25-C dimensionless scale factor within 8%. However, when the data are fitted to an extreme value distribution, the scale factor has a significantly lower slope.
3. The 99% and 99.9% LWC values were determined for four subsets of icing conditions associated with SLD environments with drops  $> 100 \mu\text{m}$  in diameter. The extreme LWC values were computed using an extreme value distribution and compared with fits from exponential, gamma and Weibull distributions. In general, the latter fits overestimated the LWC values relative to the EVD, although the Weibull distribution fits tended to agree within the 95% confidence limits. A dimensionless scale factor for SLD conditions was derived.
4. Since extreme value statistical analysis allows quantification of the nature of distributions in the tails of the distributions, and hence provides a more accurate method for determining extreme values, it is suggested that it be used when developing future envelopes in support of aircraft certification programs.



**Questions?**