



Modeling Interference Risk  
*Propagation and Other Uncertainties*

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# Outline

## Risk assessment

- Motivation, outline of method

## Case study

- MetSat/LTE in AWS-3

## Modeling challenges

- Complexity, sensitivity analysis, known unknowns, bugs

# Motivation

Demand for spectrum rights leads to

- Squeezing services together ever more tightly
- Ever-tougher trade-offs when making allocation choices

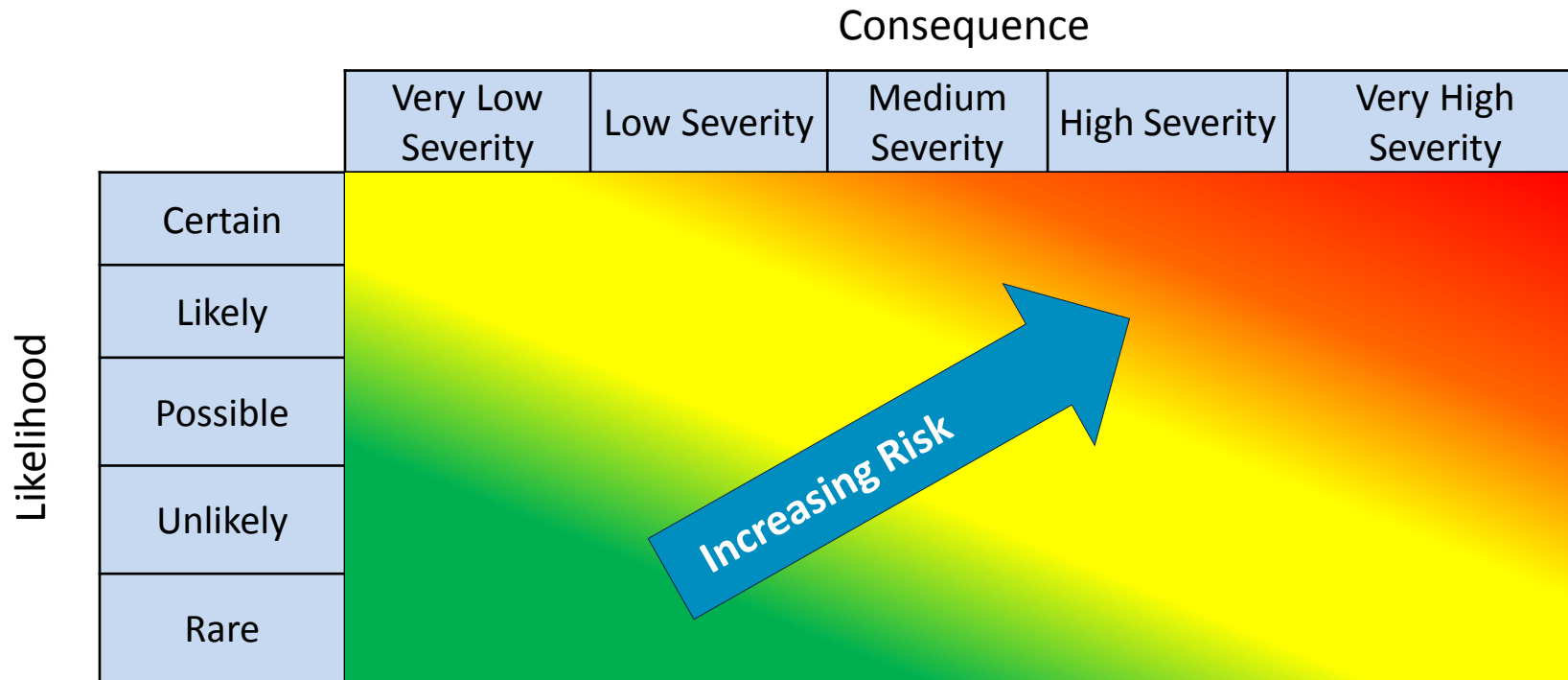
But traditional (especially worst-case) analysis often too conservative

- More protection for incumbents than they need
- Not enough headroom for entrants

Risk-informed Interference Assessment (RIIA) can help spectrum managers make better-informed trade-offs

Applications so far: MetSat/LTE, LTE-U/Wi-Fi, non-GEO satellites

# Engineering risk assessment: A well-trodden path



## The “risk triplet”

1. What things can go wrong?
2. What are the consequences?
3. How likely are they?

## Worst case

1. One hazard
2. Most severe consequence
3. Ignore probability

# A method

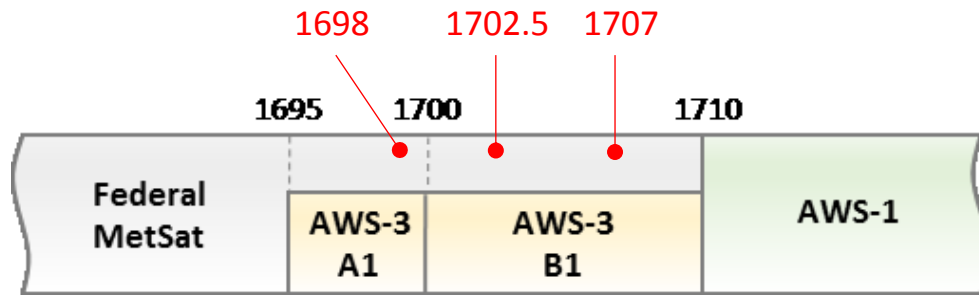
1. Make inventory of hazards
2. Define consequence metric
3. Assess likelihood & consequence for various interference modes (hazards)
4. Aggregate results

## Case study: Weather Satellite/LTE coexistence

h/t Paul McKenna, Ed Drocella

De Vries, Livnat & Tonkin, "A risk-informed interference assessment of MetSat/LTE coexistence," *IEEE Access*, 2017

# MetSat/LTE coexistence



## Incumbents

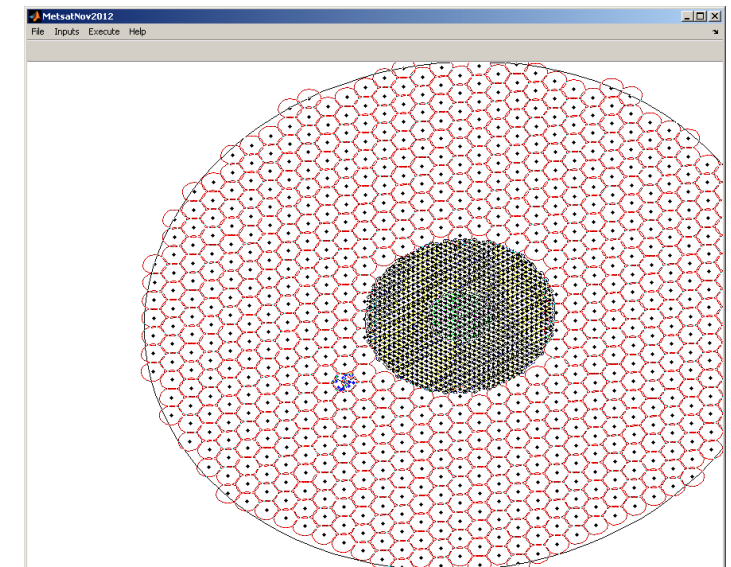
- Polar and geostationary meteorological satellites (MetSat)

## Entrants

- Cellular uplink (LTE UEs) → aggregate interference

Studied by NTIA in 2010, and CSMAC/NTIA in 2013

Bands assigned in 2015 cellular auction with rules based on CSMAC report



# Step 1: Make inventory of hazards

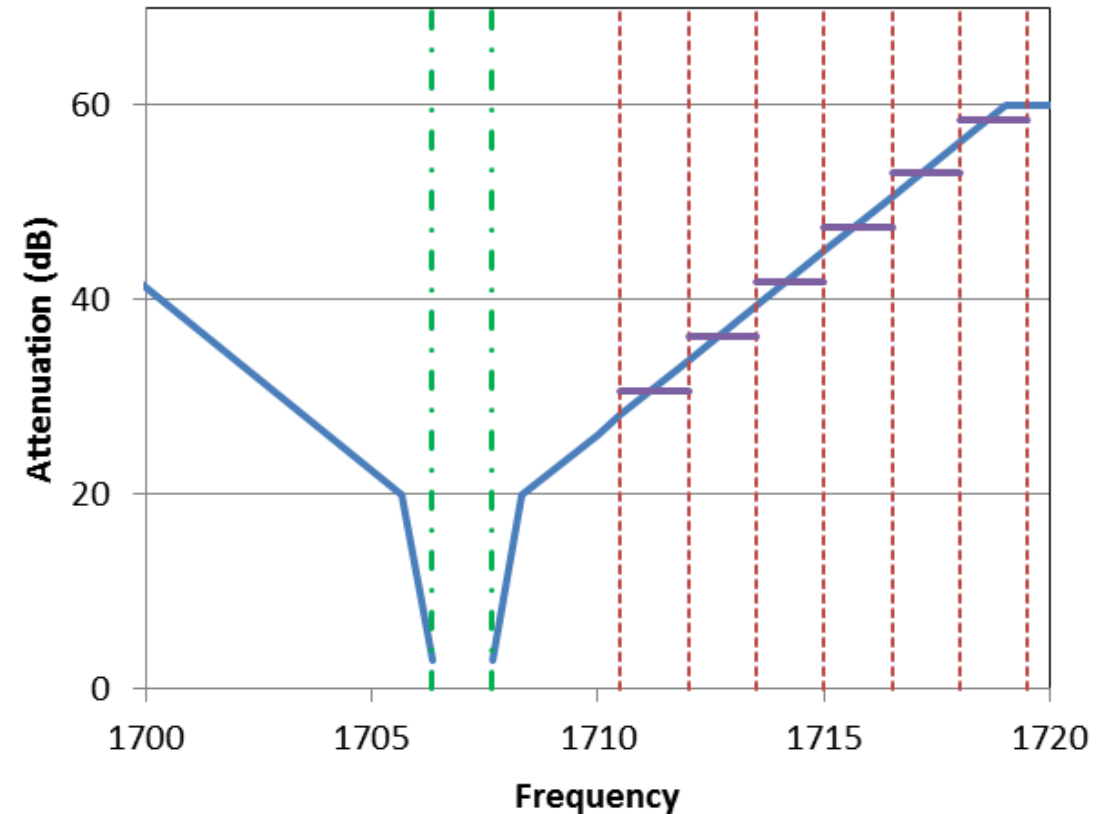
## Hazards

- **Co-channel interferers**
  - LTE mobiles outside exclusion zone
- **Frequency-adjacent interferers**
  - Existing AWS-1 cellular allocation – no exclusion zone

## Ignored

- **Intermod & spurious emissions**
- **Non-interference hazards**
  - Desired signal fluctuation, component failure, human error

**MetSat Adjacent Channel Selectivity**





## Step 2: Define consequence metric

Use ITU-R SA.1026-4 MetSat Interference Protection Criteria (IPC)

“Long-term” (occasional satellite signal fades)

- 5° earth station antenna elevation
- Interference power not-to-be-exceeded > 20% of time

“Short-term” (occasional strong interference)

- 13° elevation
- Interference power not-to-be-exceeded > 0.0125% of time

For HRPT service, 29.5 dBi antenna, 1.33 MHz receiver bandwidth, the IPCs are

- Long-term: -116.1 dBm, NTE > 20% of time
- Short-term: -114.1 dBm, NTE > 0.0125% of time

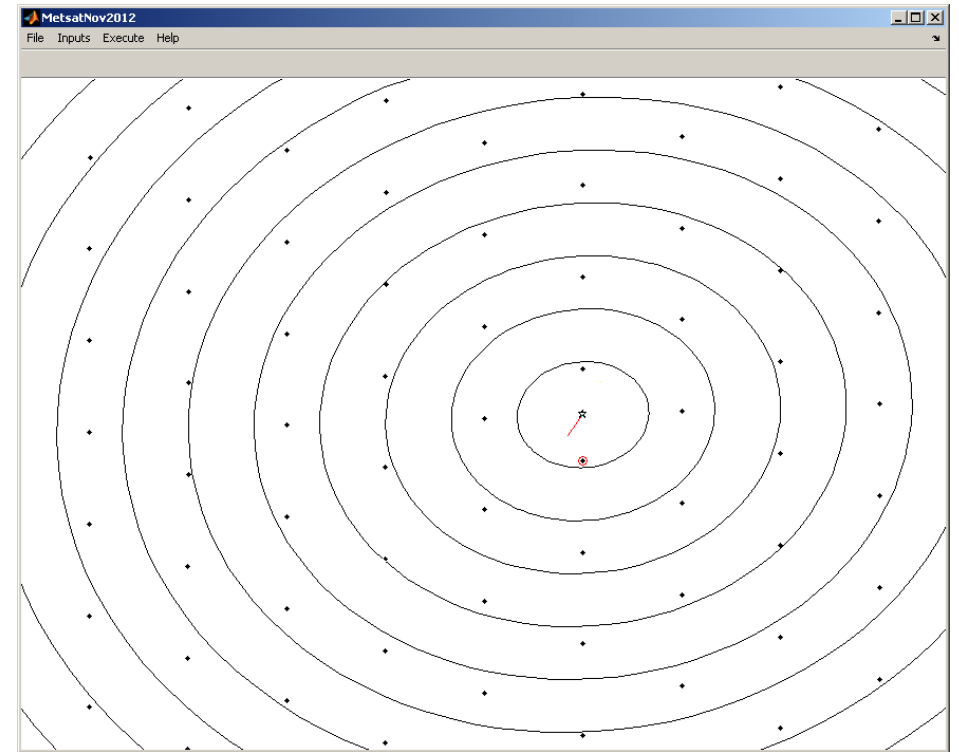
# Step 3: Calculate likelihood/consequence

Assess likelihood & consequence for various interference modes using Monte Carlo modeling

- Follow CSMAC modeling assumptions

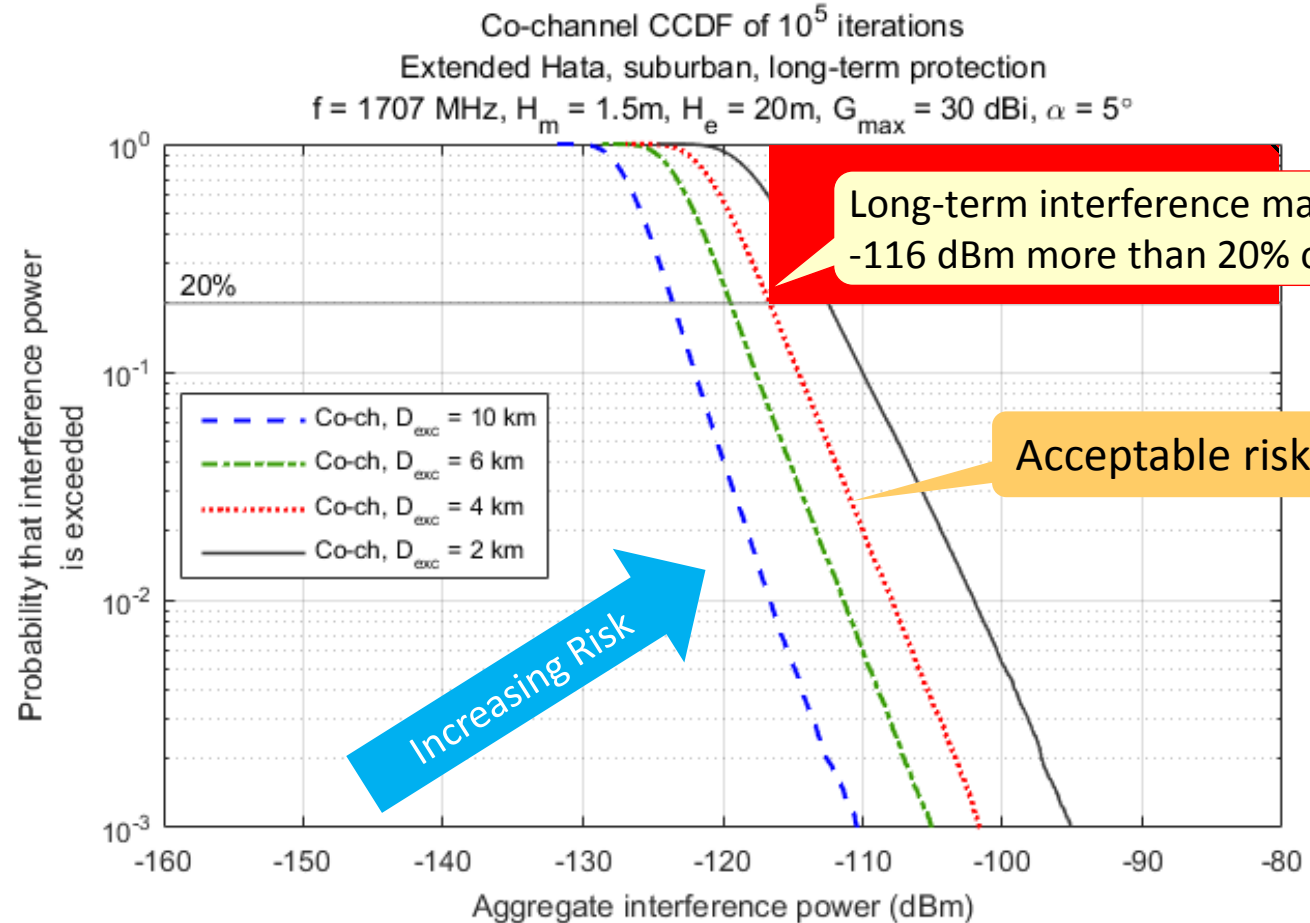
For each inner radius (exclusion distance)

- Do N times
  - Place UEs randomly between inner and max simulation radius; use suburban or rural density depending on location
  - Calculate net interfering power for each UE, and sum over all of them
  - $N = 10,000$  to 1 million, depending on time %
- Calculate probability distribution of aggregate interfering power



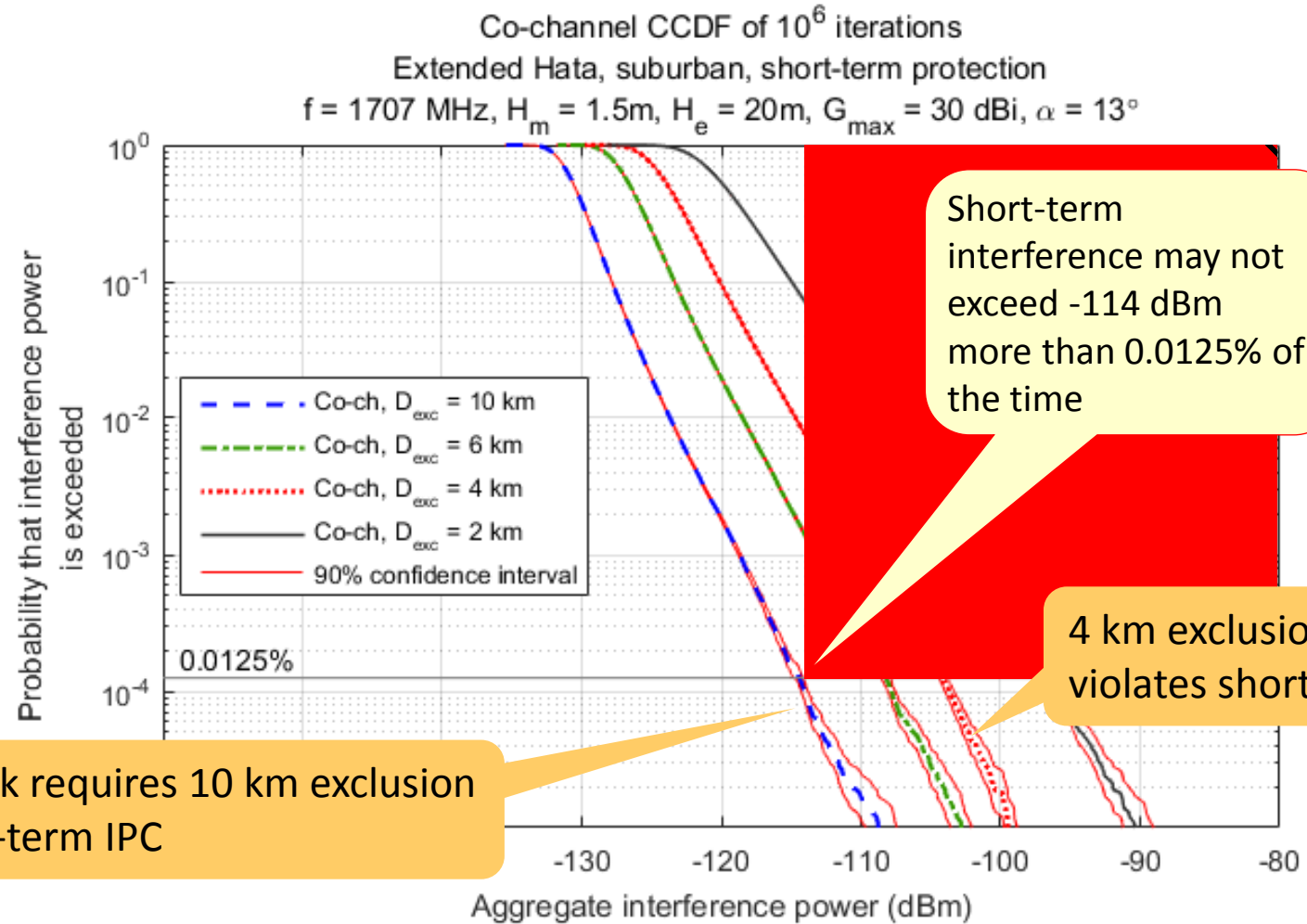
# Long-term IPC (5°) requires 4 km exclusion

**Likelihood:** Exceedance probability

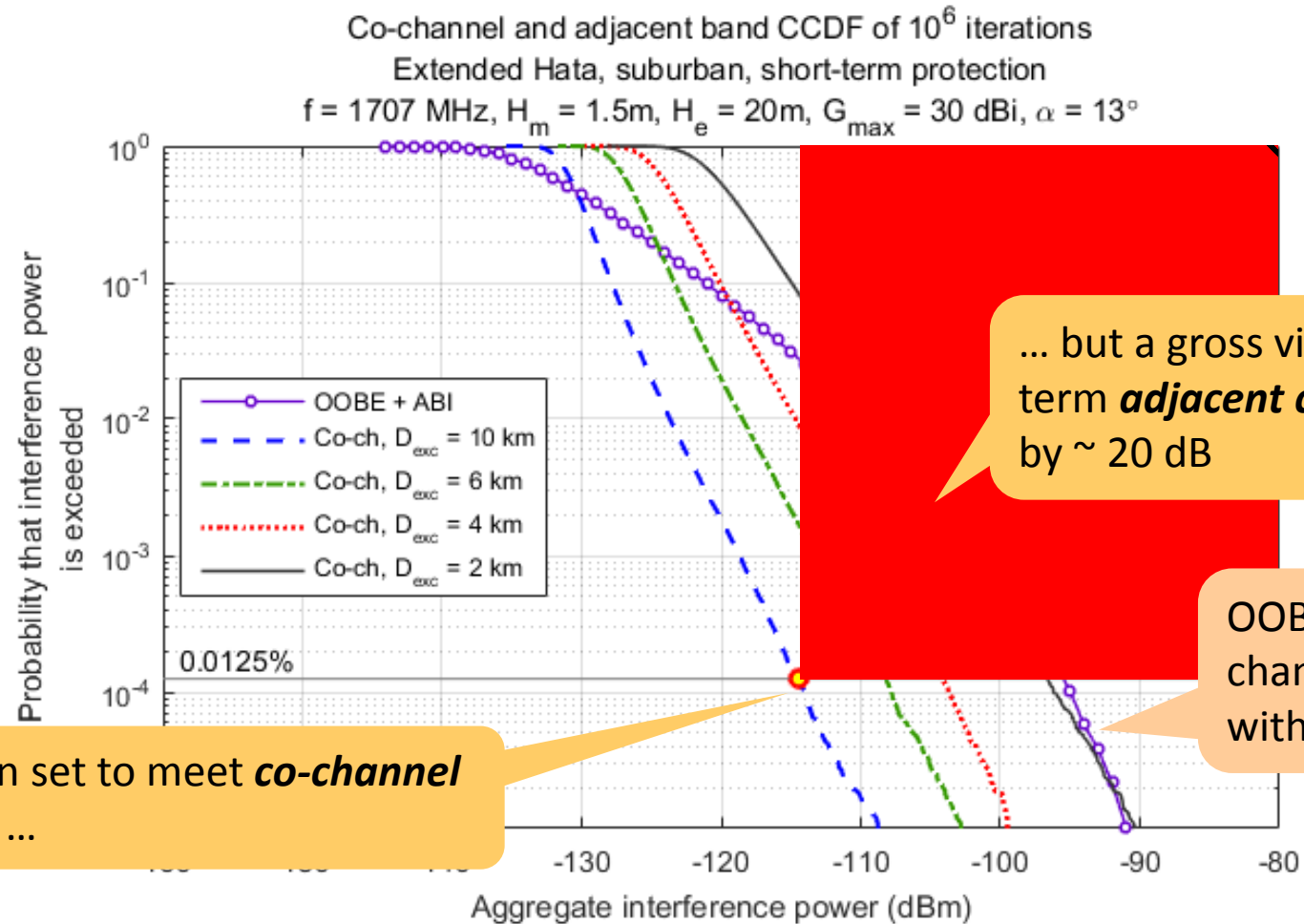


**Consequence:** Aggregate interference power

# BUT: short-term IPC ( $13^\circ$ ) sets co-channel exclusion



# Step 4: Aggregate results with adj. band interferers



10 km exclusion set to meet *co-channel* short-term IPC ...

... but a gross violation of short-term *adjacent channel* IPC by  $\sim 20$  dB

OOB + ABI similar to co-channel interference with 2 km exclusion

*Modeling challenges*

It's tough to make predictions, especially about the future

Yogi Berra

# Modeling Challenges

1. Sensitivity to assumptions
2. Lots of parameters
3. Known unknowns
4. Bugs

## *Sensitivity analysis*

Remember that all models are wrong;  
the practical question is  
how wrong do they have to be  
to not be useful

– George Box



# 1. Sensitivity analysis

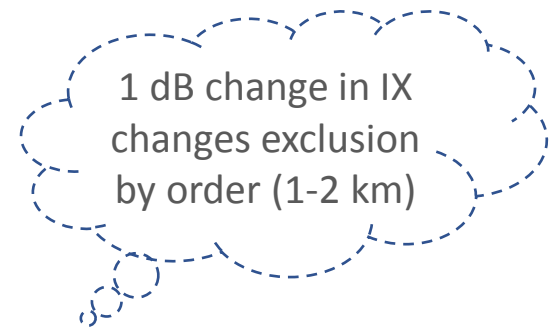
Which parameters strongly influence the outcome?

- Inform judgment about whether calculated risks are believable
- Provide insights about which mitigation strategies to pursue

For MetSat/LTE, explored the effects of

- Propagation modeling
  - Extended Hata vs. ITM, urban and suburban clutter, ITM terrain characterization, and location variability in Extended Hata
- Earth station antenna characteristics
  - Gain, elevation angle, height
- Out-of-band effects
  - OOBE filtering in mobiles, ACS of MetSat receivers

# Propagation – most significant uncertainty



## Model parameters

- Inapplicable model choice (e.g. baseline (rural) ITM in suburban area) can increase aggregate interference power by **more than 20 dB** increasing exclusion distance from 10 km to > 60 km
- Reducing ITM terrain roughness  $\Delta h$  from 90 m to 30 m decreases the path loss by **5 to 10 dB**
- For like-to-like comparisons (e.g. Extended Hata and ITM, both with suburban clutter,  $\Delta h = 90$  m in ITM), differences in path loss are **less than 5 dB**

## Clutter model

- Path loss changes by **tens of dB** depending on whether rural, suburban, or urban conditions are selected

## Location variability

- For the short-term IPC, increasing the s.d. of location variability by 2 dB leads increases aggregate interference power by **6 to 8 dB**

# Earth station characteristics

Knowable variability from one station to the next – not modeling uncertainty

- While these are fixed and known for a given location, the analysis gives an indication of how sensitive the results are to errors in the assumed parameter values

Increasing the antenna height or gain reduces aggregate interference power

- Height 20 m to 55 m reduce interference by up to 10 dB
- Gain from 30 dBi to 40 dBi reduces interference by 2.5 dB

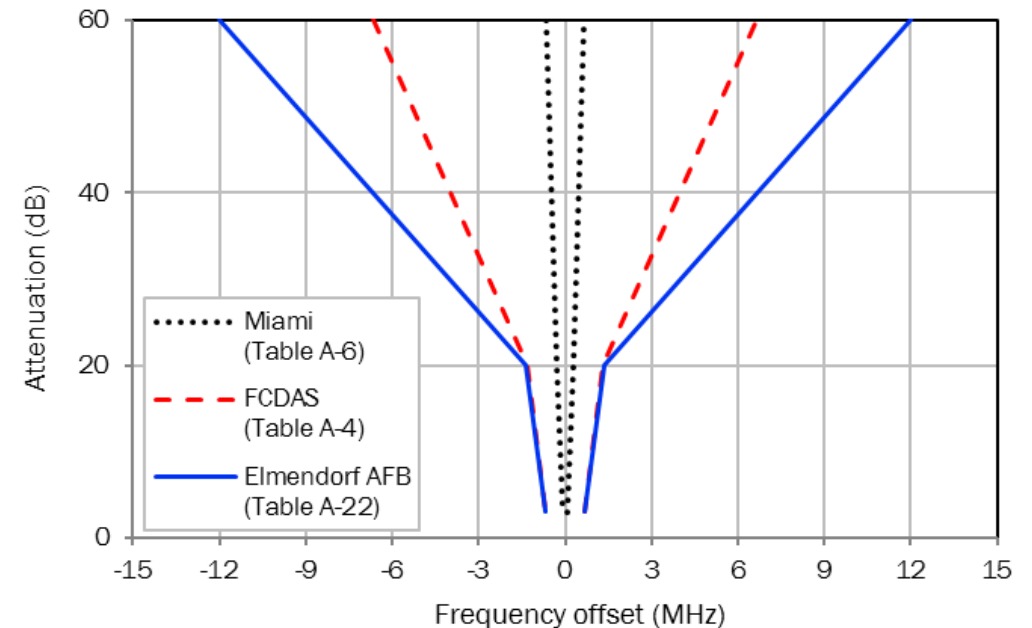
# Out-of-band effects

## LTE transmitter (~ Adjacent Channel Leakage Ratio)

- Baseline: ACLR uniformly distributed between 30 and 40 dB
- Sensitivity: all emitters to have 30 dB, or all have 40 dB ACLR
- → either leads to change of **3–5 dB** in the aggregate interference power

## MetSat receiver (~ Adjacent Channel Selectivity)

- Baseline: relatively wide ACS mask of Elmendorf AFB in Anchorage
- Narrower mask of FCDAS in Fairbanks → **10 dB** decrease in interference power (@ 10 km exclusion)



*Lots of parameters*

Any darn fool can make something complex;  
it takes a genius to make something simple.

– Pete Seeger

## 2. Very high-dimensional parameter spaces

Lots of parameters

- **Link**, e.g. frequency, weather, path length, ...
- **Device specs** e.g. transmit power, antenna pattern, ACLR, ACS, ...
- **Deployment**: location types, device density, topology, ...
- **Business**: who deploys what, when
- **Operation**: channelization, duty cycle, # active devices, ...
- **Consequence metrics**: aggregate inference (absolute or ratios); throughput (Tp) or degradation of throughput (DTp), mean %DTp, percentile %DTp; mission/business metrics

Generating results is easy; the challenge is to make sense of, communicate, and act on them

### *Responses*

Pick one case

- Often worst case, unlikely to be socially optimal

Boil answers down to a single (binary ;-)  
number

- The world isn't like this

Scenario planning

- Often generates 70–80 key factors
- Package results as 3–5 alternate futures
- Policy should ideally be robust across scenarios

Policy gaming

- Build interactive models for decision makers

*Known unknowns*

There are no facts about the future

– David Hulett

# 3. Epistemic uncertainty

## Examples

- **Device characteristics**
  - e.g. depend on technology, could be different in future
- **Deployment**
  - e.g. geo density of LTE handsets
- **Unforeseen use cases**
  - e.g. drones in AWS-3

## Many semi-equivalent distinctions

- **Aleatory variability (frequentist) vs. epistemic uncertainty (Bayesian)**
- **Risk vs. uncertainty (Frank Knight)**
- **Ergodic vs. non-ergodic**
- **Stationary vs. non-stationary**

## *Responses*

### Guess first, fix later

- **Hard to change once interests have vested**
- **Policy is a “wicked problem”; decisions can’t be unwound**

### Risk management as well as risk assessment

- **On-going rules maintenance based on modeling and experience**

### Bayesian Belief Networks to model causal relationships

- **Given current knowledge, calculate probability of specified outcomes**

### Humility



## *Bugs*

There are two ways to write error-free programs;  
only the third one works

– Alan Jay Perlis

# 4. Mistakes and errors

As more modeling is used in spectrum management, there will be more mistakes

- MetSat example, TAC → IEEE paper: found error in antenna pattern

## ***Responses***

Revert to back-of-the-envelope calculations

- But: a reasoned, wrong answer is still better than a WAG

Insist on reproducibility

- “Show Your Work”
- Disclose assumptions, data, methods, code
- Disclose interests

When modeling leads to rules, what happens when errors are discovered?

- What if there were errors in CSMAC analysis that set MetSat protection zone distances?

## ***Responses***

Live with it

- But if a wrong answer is OK, why struggle to get a right answer?

Let the market fix it

- Needs clear-enough initial rights assignment, and liquid market

Revise rules

- Ad hoc change, or sunsets
- “Dynamic” rules

*Wrap-up*

Too soon old, too late smart

# Themes

## Risk-informed interference assessment works

- Required tools/techniques widely used, just requires a different mixture for RIIA
- Can be applied to real-world spectrum cases: MetSat/LTE, LTE/Wi-Fi, inter-satellite
- Yields useful insights

## Limits of statistical modeling; responses?

- Pick one case, report results as yes/no
- Plan for surprise
- Scenario planning, Bayesian Belief Networks, ...
- Fix it later
- etc.

# Questions

How to communicate results of high-dimensional spaces so information is actionable?

- Pick one case, scenario planning, policy gaming, ...?

How to handle model sensitivity order(10 dB)?

- Worst case, design margin, ...?

How to deal with epistemic uncertainty?

- Bayesian Belief Networks, ex post rather than ex ante, plan for surprise, ...?

How to respond *post hoc* to material modeling errors ?

- Give up modeling, require reproducibility, ongoing risk management , ...?
- Live with the outcome, let the market adjust, revise rules, dynamic rules, ...?

Backup

# References

G. A. Miller, "The magical number seven, plus or minus two: some limits on our capacity for processing information." *Psychological Review*, vol. 63, no. 2, pp. 81-97, 1956. <http://dx.doi.org/10.1037/h0043158>

H. W. J. Rittel and M. M. Webber, "Dilemmas in a general theory of planning," *Policy Sciences*, vol. 4, pp. 155-169, 1973.  
[http://www.uctc.net/mwebber/Rittel+Webber+Dilemmas+General Theory of Planning.pdf](http://www.uctc.net/mwebber/Rittel+Webber+Dilemmas+General+Theory+of+Planning.pdf)

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# MetSat/LTE Sensitivity Analysis Results

		Co-channel exclusion distance (km)	
Parameter / Value		From IPC	Match OOBE+ABI
Propagation	<b>Baseline analysis</b>	<b>10</b>	<b>2</b>
	<b>Propagation model and clutter (baseline: Extended Hata, suburban)</b>		
	Extended Hata, urban	5	<1
	ITM, Dh = 10 m, rural, base ITM case	60	10
	ITM, Dh = 30 m, rural, base ITM case	67	11
	ITM, Dh = 30 m, suburban, 15 dB correction	39	8
	ITM, Dh = 30 m, urban, 27 dB correction	18	3
	ITM, Dh = 90 m rural, base ITM case	65	11
	ITM, Dh = 90 m, suburban, 15 dB correction	27	5
	ITM, Dh = 90 m, urban, 27 dB correction	11	<1
Antenna	<b>Location variability (baseline: 8 dB)</b>		
	6 dB	6	2
	10 dB	18	4
	12 dB	29	7
	<b>Antenna height (baseline: 20 meters)</b>		
	15 meters	8	2
	35 meters	16	4
	55 meters	22	7
	<b>Antenna gain / short-term protection limit (baseline: 30 dBi / -114 dBm)</b>		
	40 dBi / -105 dBm	4	2
<b>Antenna elevation (baseline: 13 degrees)</b>			
20 degrees	8	2	

Note: sensitivity analysis did not change the basic conclusions (i.e. short-term IPC is the binding constraint; adjacent channel interference is much higher than co-channel)



# Corrections to ITM for “urban” areas

Table 2. Urban Factor:  $A(\text{Okumura}) - A(\text{Longley-Rice})$  dB

d km	Frequency							
	100	150	200	300	500	1000	2000	3000 MHz
10	16.2	17.4	20.6	22.9	26.6			
20	13.4	15.9	18.2	20.6	24.1	29.4	36.3	
30	11.5	14.3	16.4	19.1	22.7	27.4	34.0	38.3
40	10.9	13.4	15.3	17.9	21.5	26.0	31.9	35.7
50	10.0	12.8	14.8	17.5	20.7	25.3	30.7	34.2
60	9.3	12.1	13.5	16.4	19.4	24.0	29.1	32.2
70	8.6	11.2	12.8	15.3	18.2	22.5	26.2	28.8
80	8.0	10.6	12.0	14.2	16.4	20.0	22.7	24.3
90	7.3	9.4	10.7	12.0	13.8	16.9	18.5	19.4
100	6.5	7.7	8.3	10.0	11.2	13.5	14.1	15.2

$h_1 = 200$  m,  $h_2 = 3$  m

A. G. Longley, "Radio propagation in urban areas," OT Report 78-144, Mar. 1978.

# Beware terminology – what’s “urban”?

Okumura’s measurements were performed in 1963 and 1965 in Japan

Therefore, “urban” clutter as measured by Okumura (1968) and as defined in the Extended Hata model is likely to represent propagation in present-day suburbia—not today’s big cities

→ propagation in today’s suburbs should be modeled as urban, not suburban, in terms of the Okumura-Hata model family



Yurakucho, Tokyo, ca. 1960



Shibuya, Tokyo, ca. 1960



Seattle, WA, ca. 2015



Kirkland, WA, ca. 2015

# Propagation model parameters

Propagation model parameters can change exclusion distances dramatically

Terrain roughness  $\Delta h$ :

~ 90 m for average terrain,

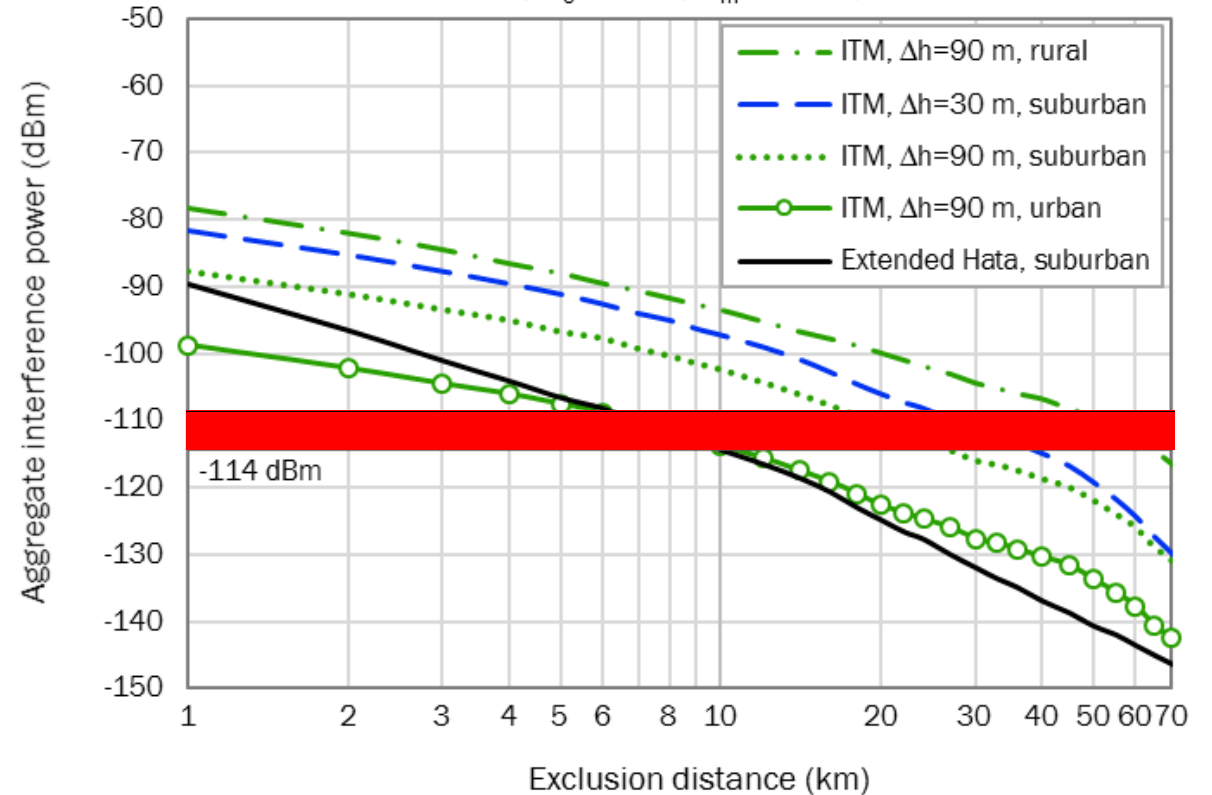
~ 30 m for flat plains

ITM urban correction factors over rural follow Longley (1978):

Suburban 15 dB

Urban 27 dB

Co-channel aggregate interference power, short-term protection (0.0125%)  
 $f=1707$  MHz,  $H_e=20$  m,  $H_m=1.5$  m,  $\alpha=13^\circ$

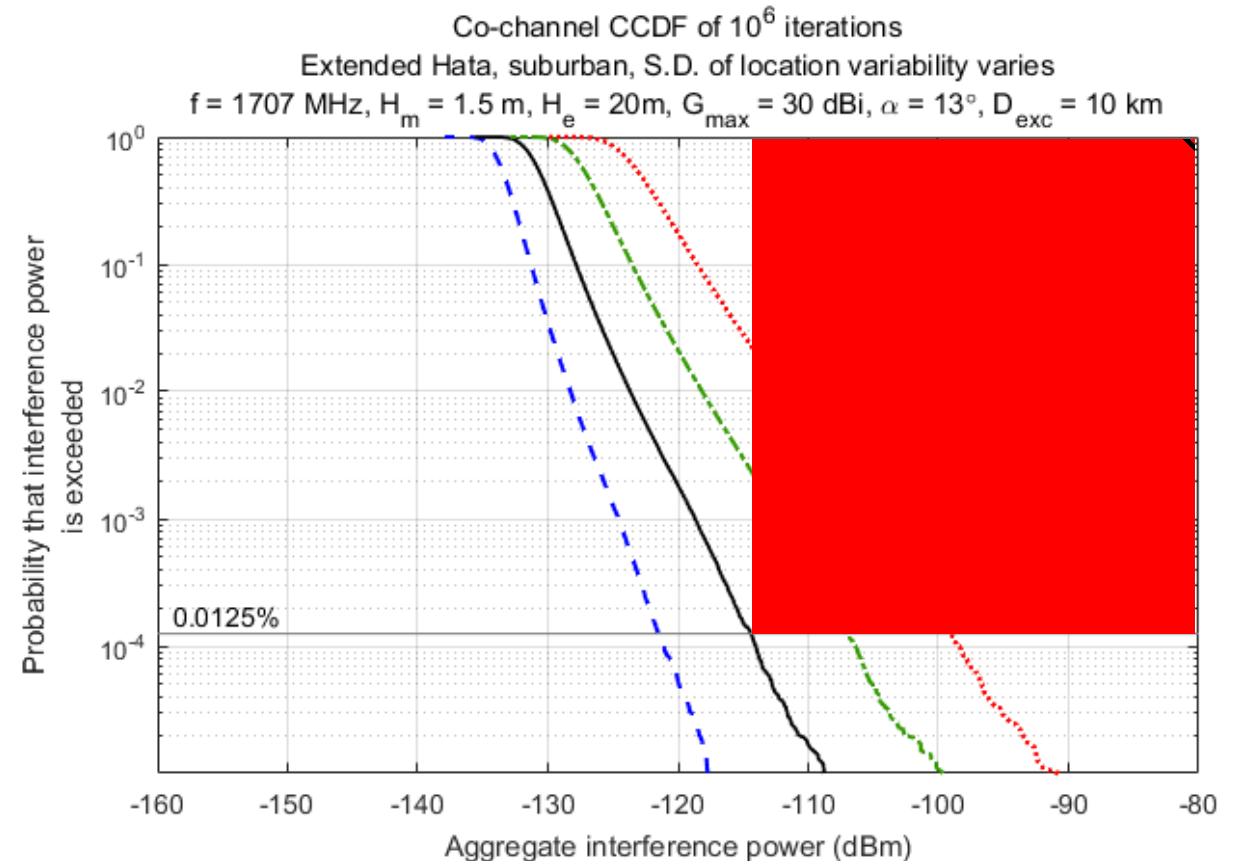


# Location variability

Co-channel interference exceedance probability, short-term protection scenario, based on the Extended Hata suburban model with different values for the standard deviation of the location variability

The statistics of path loss, as well as the median value, must be considered in any interference analysis

As the exceedance probability decreases, the curves move farther apart → more sensitive to parameter choice at extreme values

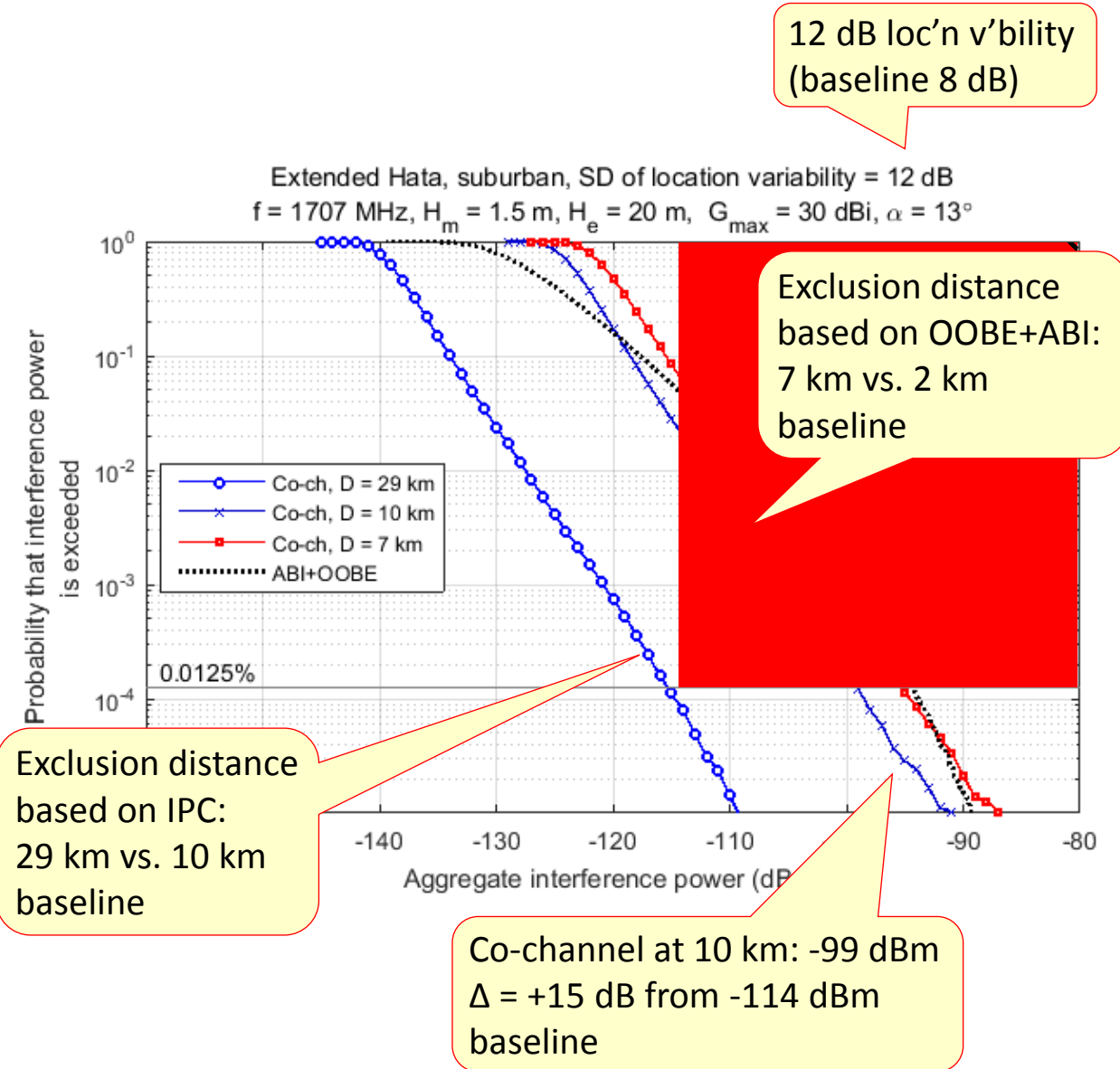


# Location variability impact

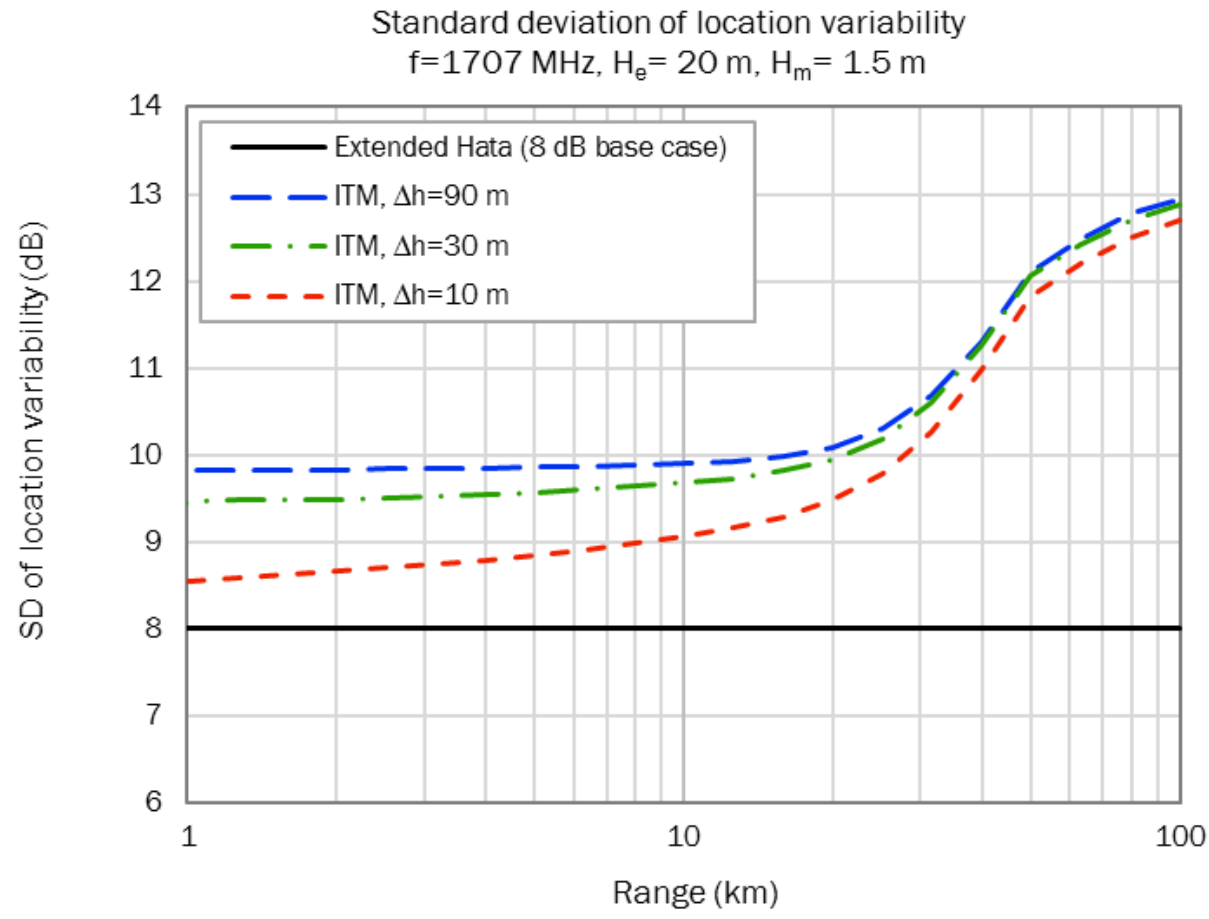
Increasing s.d. of location variability from 8 dB baseline to 12 dB increases exclusion distance from 10 km to 29 km

Exclusion based on equalizing co-channel with OOBE+ABI increases from 2 km to 7 km

If 10 km exclusion had been chosen, aggregate interference would be 15 dB above the IPC



# Standard deviation of location variability for ITM and Extended Hata





# Measures that would support good RIIA

Statistical protection criteria (signal level + probability) assist risk assessment

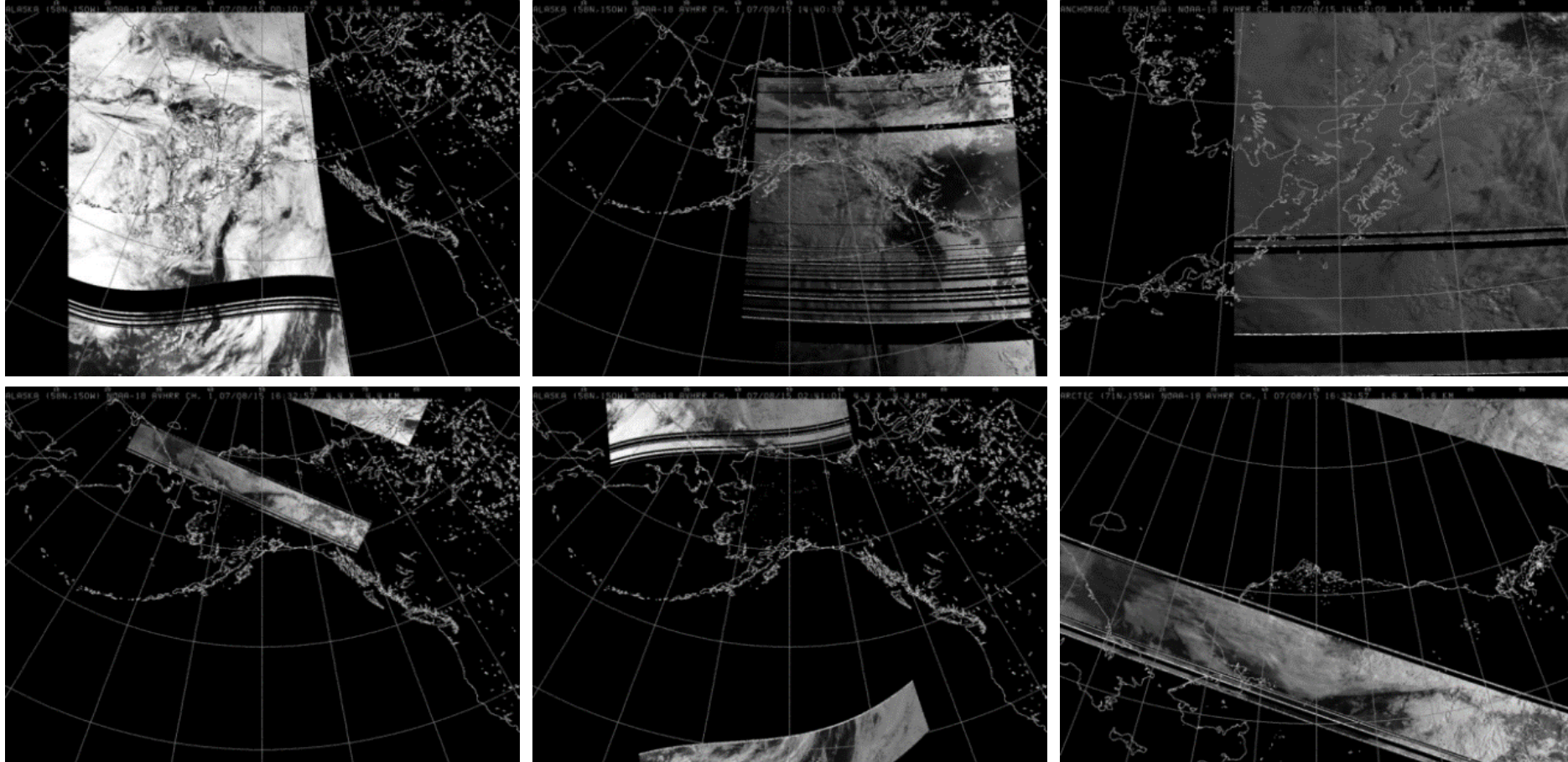
Better documentation of baseline performance data, assumptions/basis of recommendations

- Encourage (incentivize) services seeking protection to disclose baseline system performance information
- Encourage parties (petitioners and standards orgs) to disclose methods underlying interference criteria and coexistence assessments

Complement RIIA with economics, e.g.

- Cost-benefit analysis
- Impact assessments

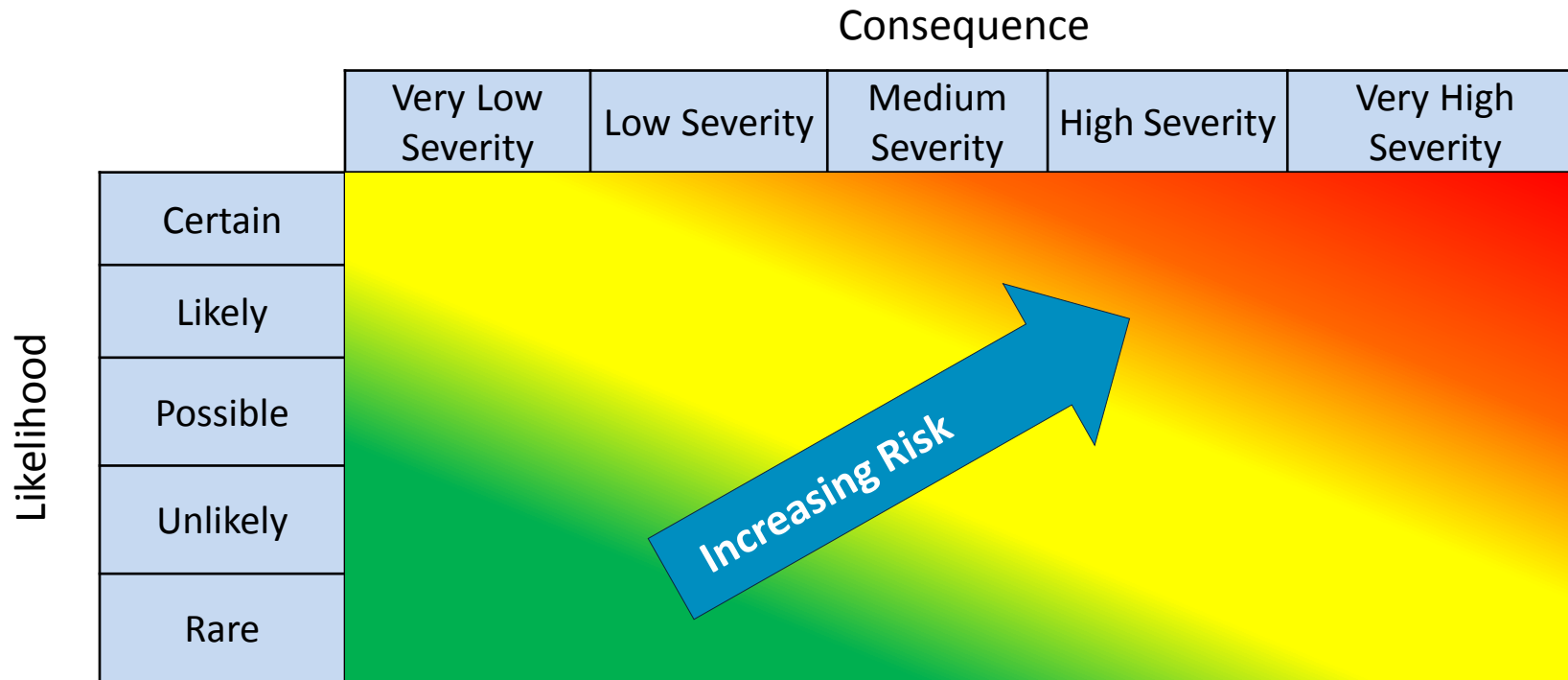
# Baseline MetSat risk undocumented – but substantial



About 10% of images from NOAA in Juneau Alaska were like this in June 2015, *before* re-allocation



# Engineering risk assessment: A well-trodden path





## The “risk triplet”

1. What things can go wrong?
2. What are the consequences?
3. How likely are they?

## Worst case

1. One hazard
2. Most severe consequence
3. Ignore probability

Time	Conditions	Temp.	Feels Like	Precip	Amount
3:00 pm	 Showers	52 °F	50 °F	<a href="#">80%</a>	<a href="#">0.01 in</a>
4:00 pm	 Showers	51 °F	50 °F	<a href="#">54%</a>	<a href="#">0.01 in</a>

A model should yield answers we believe  
to questions that matter

– Paul Romer