

Casualty Actuaries in Reinsurance  
2012 Seminar  
CAT Pricing Methods

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- No statements about the views or proprietary practices of prior employers will be made or should be inferred.
- No liability whatsoever is assumed for any damages, either direct or indirect, that may be attributed to use of the methods discussed in this presentation.
- Writing CAT covers is risky – results may be catastrophic to your bottom line.
- Examples are for illustrative purposes only. Do not use in any example in real-world applications.
- There may be a quiz at the end – so take good notes!

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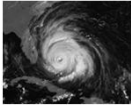
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## Agenda

-A Mix of Theory and Practice

- CAT Context
- Pricing Overview
- Statistics from Ordered Random Trials
- Basic Equations
- Required Capital Paradigms
- Order Dependence and Reference Portfolios
- Risk Measures
  - Definition and Properties
  - Take your pick
  - Ranking definitions of Var and TVaR
  - TVaR different from CTE
  - VaR Subadditivity –epic fail
- Real Allocation Approaches
  - Co-VaR instability
  - Co-TVaR not subadditive
- Conclusions



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## Context

- CAT Pricing is part of the process of writing CAT business, but not the only part.
- Pricing models give indications – the market sets the price.
- Business bunched –lots of 1/1s.
- Authorized share vs bound share.
- Real time- by time a treaty gets bound, the portfolio has changed.
- Methods may not extend to direct/large volume/small risk business

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## Portfolio Management

- Risk Management sets limits on PMLs and TIV/Limit Aggregations by peril/zone .
  - Compliance monitoring essential
- Selection problem is constrained optimization: Reinsurers looks to get most profitable portfolio with smallest risk.
- Does pricing help optimize/solve the selection problem?
- Have faulty pricing methods led to de-worsification??

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### Pricing Overview

- UNL traditional product vs CAT Bonds vs ILWs
- Why do reinsurers have different pricing indications ?
- Emerald City Pricing: Don't look at the man behind the curtain
  - Different vendor models/different switches
  - Delay in adopting new versions
  - Differences in data quality
  - Loading factors and adjustment factors
- Non-modeled CAT events (Thai flood): Not always priced
  - Ostrich Excuse - "It was not in the model"
  - Hiding-in-Plain-Sight Swan - May not show up on risk management radar – obvious after the fact.
- Pricing Method Flavors: Different ways of translating model stats into indicated prices.
  - Can't we just all agree?

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Equations and Properties

### CAT PRICING

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### Basic Equations

~  $P = E[X] + RL(X)$   
P = Indicated premium prior to expense loading  
X = CAT Loss  
RL(X) = Risk Load

~  $RL(X) = r_{target} * C(X)$

~ C(X) = Required Capital

~ RORAC Approach  
· Universally used in actual CAT Treaty pricing



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What is the right way to compute Required CAT Capital?



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Required Capital Paradigms <sup>11</sup>

- Standalone:  $C(X) = \rho(X)$ , where  $\rho(X)$  is a risk measure.
- Incremental: Let  $T$  be the existing portfolio  
 $C(X|T) = \rho(T+X) - \rho(T)$ ,
- Real Allocation  
 $C(X|T) = A(X,T) * \rho(T+X)$



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Order Dependence and Reference Portfolios <sup>12</sup>

- “ Order Dependence – Pricing depends on the order in which accounts are priced (Mango)
- “ A major problem for Incremental methods
- “ A small problem for Allocation methods
- “ Not a problem for Standalone
- “ Reference Portfolio Cure
  - . Portfolio fixed over a given period
  - . How often should it be updated??

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### Risk Measure: Definitions and properties

- A **risk measure**,  $\rho$ , is a monotonic function that maps a real-valued random variable,  $X$ , to a non-negative number,  $\rho(X)$ , such that:
- Risk Measure Basic Properties
  1. *Non-negative*:  $\rho(X) \geq 0$
  2. *Monotonic Premium*: If  $X_1 \leq X_2$ , then  $E[X_1] + \rho(X_1) \leq E[X_2] + \rho(X_2)$
- A risk measure is **pure** if it maps constants to zero:  $\rho(c) = 0$




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### Risk Measure: Coherence properties

1. Scalable:  $\rho(\lambda X) = \lambda \cdot \rho(X)$
2. Translation Invariant:  $\rho(X + \alpha) = \rho(X)$
3. Subadditive:  $\rho(X_1 + X_2) \leq \rho(X_1) + \rho(X_2)$ 
  - ~ Some academicians refuse to refer to a function as a risk measure unless it is coherent
  - ~ Most academicians uses reverse signs (  $X$  represents the value of assets instead of CAT losses)




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### Risk Measures: Take Your Pick

1. *Variance*:  $Var(X) = E[(X - \mu)^2]$
2. *Semivariance*:  $Var^+(X) = E[(X - \mu)^2 | X \geq \mu] \cdot Prob(X \geq \mu)$
3. *Standard Deviation*:  $\sigma = Var^{1/2}(X)$
4. *Semi Standard Deviation*:  $\sigma^+ = Var^{+1/2}(X)$
5. *Value at Risk*: for  $0 < \theta < 1$ ,  $VaR(\theta) = \sup\{x | F(x) \leq \theta\}$
6. *Tail Value at Risk*:  $TVaR(\theta) = \text{conditional mean for all } x \text{ values associated with the tail, } 1 - \theta, \text{ of probability}$
7. *Excess Tail Value at Risk*:  $XTVaR(\theta) = TVaR(\theta) - \mu$
8. *Distortion Risk Measure*: (Wang)  $E^*[X] = E[X^*]$  where  $F^*(x) = g(F(X))$  for  $g$  a distortion function
9. *Excess Distortion Risk Measure*:  $E^*[X] - E[X]$




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**CALCULATIONS AND  
COUNTEREXAMPLES**

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**Random Trials**

Trial Year	Event 1	Event 2	Event 3	...	Largest Event over the Year	Total Annual Loss
1	40,000	-	-	-	40,000	40,000
2	2,100	3,500	450	-	3,500	6,050
3	-	-	-	-	0	0
4	5,500	27,550	-	-	27,550	33,050
5	700	400	50	-	700	1,150
6	1,250	900	25	-	1,250	2,175
7	8,750	-	-	-	8,750	8,750
8	75	45	70,000	-	70,000	70,120
9	-	-	-	-	0	0
10	15	3,500	45	-	3,500	3,560
⋮	⋮	⋮	⋮	⋮	⋮	⋮
9998	25	-	-	-	25	25
9999	550	7,750	-	-	7,750	8,300
10000	650	-	-	-	650	650

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**AEP and OEP PML from Ordered Trials <sup>18</sup>**

Trial Year Rank	Largest Event	Total Annual Loss
1	125,000	175,000
2	125,000	170,000
3	125,000	165,000
4	100,000	137,500
5	100,000	135,000
6	100,000	130,000
7	80,000	125,000
8	80,000	115,000
9	80,000	110,000
10	80,000	110,000
⋮	⋮	⋮
99	21,250	37,500
100	21,000	36,675
101	21,000	35,950
⋮	⋮	⋮
9998	-	0
9999	-	0
10000	-	0

100/10000 = 1.0%  
 100 year return period  
 AEP PML = 36,675  
 OEP PML = 21,000

- PML = Probable Maximum Loss = VaR
- AEP = Annual Exceeding Probability
- OEP = Occurrence Exceeding Probability

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Ranking Definition of VaR and TVaR on <sup>19</sup>  
Random Sample Data

- Let  $X_1 \geq X_2 \geq \dots \geq X_n$  be an ordering of  $n$  trials of  $X$
- Suppose  $k = (1 - \theta)n$ , then

$$VaR(\theta) = X_k$$

$$TVaR(\theta) = \frac{1}{k} \sum_{j=1}^k X_j$$



- Note TVaR is not necessarily equal to the Conditional Tail Expectation (CTE) when the data is discrete.
- $CTE(\theta) = E[X | X > VaR(\theta)]$

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TVaR and CTE - not the same

Statistic	Value	Results	A	Ref	A+Ref
Trials	10	Mean	2.80	26.00	28.80
Pct	50%	VaR	2.00	33.00	34.00
Rank	5	TVaR	5.00	34.80	35.40
		CTE	5.75	36.00	35.75

Loss Data by Trial				Separately Ordered Loss Data			
Trial	A	Ref	A+Ref	Rank	A	Ref	A+Ref
1	8.00	12.00	20.00	1	8.00	37.00	37.00
2	0.00	37.00	37.00	2	7.00	36.00	36.00
3	0.00	36.00	36.00	3	4.00	35.00	35.00
4	0.00	35.00	35.00	4	4.00	33.00	35.00
5	1.00	33.00	34.00	5	2.00	33.00	34.00
6	2.00	17.00	19.00	6	2.00	27.00	31.00
7	7.00	16.00	23.00	7	1.00	17.00	23.00
8	2.00	33.00	35.00	8	0.00	16.00	20.00
9	4.00	27.00	31.00	9	0.00	14.00	19.00
10	4.00	14.00	18.00	10	0.00	12.00	18.00

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VaR Subadditivity-Epic Fail

Statistic	Value	Results	A	Ref	A+Ref
Trials	10	Mean	2.80	26.00	28.80
Pct	30%	VaR	2.00	33.00	37.00
Rank	5	TVaR	5.00	34.80	39.40

Loss Data by Trial				Separately Ordered Loss Data			
Trial	A	Ref	A+Ref	Rank	A	Ref	A+Ref
1	0.00	12.00	12.00	1	8.00	37.00	44.00
2	0.00	37.00	37.00	2	7.00	36.00	42.00
3	8.00	36.00	44.00	3	4.00	35.00	37.00
4	7.00	35.00	42.00	4	4.00	33.00	37.00
5	4.00	33.00	37.00	5	2.00	33.00	37.00
6	2.00	17.00	19.00	6	2.00	27.00	29.00
7	0.00	16.00	16.00	7	1.00	17.00	19.00
8	4.00	33.00	37.00	8	0.00	16.00	16.00
9	2.00	27.00	29.00	9	0.00	14.00	15.00
10	1.00	14.00	15.00	10	0.00	12.00	12.00

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### Real Allocation Approaches

1. *Stand-alone Risk Measure as Allocation Base*
2. *Marginal Risk Measure as Allocation Base*  
 . *Adjusted for Order Dependence (Mango)*
3. *Game theory –(LeMaire) Allocation of Portfolio Consolidation Benefit*
4. *Co-Measures – (Kreps)*
5. *Percentile Allocation (Bodoff)*




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### Co-VaR Instability

Rank	VaR Percentage	Portfolio Loss	Risk A Loss
1			
98	99.02%	\$422	\$6
99	99.01%	\$408	\$0
100	99.00%	\$405	\$20
101	98.99%	\$395	\$0
102	98.98%	\$390	\$4
10,000			

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### Co-TVaR A

Statistic	Value	Results	A+Ref	A	Ref
Trials	10	Mean	27.50	2.50	25.00
Pct	50%	VaR	35.00	2.00	33.00
Rank	5	TVaR	37.00	4.40	35.00
		Co-TVaR	37.00	2.00	35.00

Loss Data by Trial				Separately Ordered Loss Data				Co-Stats	
Trial	A	Ref	A+Ref	Rank	A	Ref	A+Ref	Co-A	Co-Ref
1	2.00	8.00	10.00	1	8.00	39.00	39.00	0.00	39.00
2	0.00	38.00	38.00	2	7.00	38.00	38.00	0.00	38.00
3	7.00	30.00	37.00	3	3.00	35.00	37.00	7.00	30.00
4	0.00	35.00	35.00	4	2.00	33.00	36.00	3.00	33.00
5	3.00	33.00	36.00	5	2.00	30.00	35.00	0.00	35.00
6	2.00	13.00	17.00	6	2.00	25.00	33.00	8.00	25.00
7	0.00	39.00	39.00	7	1.00	16.00	18.00	2.00	16.00
8	2.00	16.00	18.00	8	0.00	15.00	17.00	2.00	15.00
9	8.00	25.00	33.00	9	0.00	11.00	12.00	1.00	11.00
10	1.00	11.00	12.00	10	0.00	8.00	10.00	2.00	8.00

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### Co-TVaR B

Statistic	Value	Results	B+Ref	B	Ref
Trials	10	Mean	27.50	2.50	25.00
Pct	50%	VaR	34.00	2.00	30.00
Rank	5	TVaR	37.80	4.20	35.00
		Co-TVaR	37.80	2.80	35.00

Loss Data by Trial				Separately Ordered Loss Data				Co-Stats	
Trial	B	Ref	B+Ref	Rank	B	Ref	B+Ref	Co-B	Co-Ref
1	0.00	8.00	8.00	1	7.00	39.00	44.00	5.00	39.00
2	1.00	38.00	39.00	2	5.00	38.00	39.00	1.00	38.00
3	4.00	30.00	34.00	3	4.00	35.00	37.00	2.00	35.00
4	2.00	35.00	37.00	4	3.00	33.00	35.00	2.00	33.00
5	2.00	33.00	35.00	5	2.00	30.00	34.00	4.00	30.00
6	3.00	15.00	18.00	6	2.00	25.00	32.00	7.00	25.00
7	5.00	39.00	44.00	7	1.00	16.00	18.00	3.00	15.00
8	1.00	16.00	17.00	8	1.00	15.00	17.00	1.00	16.00
9	7.00	25.00	32.00	9	0.00	11.00	11.00	0.00	11.00
10	0.00	11.00	11.00	10	0.00	8.00	8.00	0.00	8.00

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### Co-TVaR A+B

Statistic	Value	Results	A+B +Ref	A+B	Ref
Trials	10	Mean	30.00	5.00	25.00
Pct	50%	VaR	38.00	5.00	30.00
Rank	5	TVaR	40.40	8.20	35.00
		Co-TVaR	40.40	7.40	33.00

Loss Data by Trial				Separately Ordered Loss Data				Co-Stats	
Trial	A+B	Ref	A+B +Ref	Rank	A+B	Ref	A+B +Ref	Co-A+B	Co-Ref
1	2.00	8.00	10.00	1	15.00	39.00	44.00	5.00	39.00
2	1.00	38.00	39.00	2	11.00	38.00	41.00	11.00	30.00
3	11.00	30.00	41.00	3	5.00	35.00	40.00	15.00	25.00
4	2.00	35.00	37.00	4	5.00	33.00	39.00	1.00	38.00
5	5.00	33.00	38.00	5	5.00	30.00	38.00	5.00	33.00
6	5.00	15.00	20.00	6	3.00	25.00	37.00	2.00	35.00
7	5.00	39.00	44.00	7	2.00	16.00	20.00	5.00	15.00
8	3.00	16.00	19.00	8	2.00	15.00	19.00	3.00	16.00
9	15.00	25.00	40.00	9	1.00	11.00	12.00	1.00	11.00
10	1.00	11.00	12.00	10	1.00	8.00	10.00	2.00	8.00

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### Co-TVaR Subadditivity Fail

Results	A	B	A+B	Ref	A+B +Ref
Mean	2.50	2.50	5.00	25.00	30.00
VaR	2.00	2.00	5.00	30.00	38.00
TVaR	4.40	4.20	8.20	35.00	40.40
Co-TVaR	2.00	2.80	7.40	33.00	40.40

Loss Data by Trial					
Trial	A	B	A+B	Ref	A+B +Ref
1	2.00	0.00	2.00	8.00	10.00
2	0.00	1.00	1.00	38.00	39.00
3	7.00	4.00	11.00	30.00	41.00
4	0.00	2.00	2.00	35.00	37.00
5	3.00	2.00	5.00	33.00	38.00
6	2.00	3.00	5.00	15.00	20.00
7	0.00	5.00	5.00	39.00	44.00
8	2.00	1.00	3.00	16.00	19.00
9	8.00	7.00	15.00	25.00	40.00
10	1.00	0.00	1.00	11.00	12.00

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**ISSUES AND OBSERVATIONS**

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### Key Issues-Conceptual

Issue	Alternatives/Observations
Distribution Segment Focus	Far Tail vs Adverse Deviation vs Full distribution
Portfolio Dependence	<ol style="list-style-type: none"> <li>Portfolio Independent : using stand-alone or equilibrium Market price vs</li> <li>Portfolio Dependent : using incremental or allocation</li> </ol>
Pure Risk Measure	<ol style="list-style-type: none"> <li>Seems to make sense in theory</li> <li>Many measures used are not pure</li> </ol>
Coherence	<ol style="list-style-type: none"> <li>Absolutely necessary</li> <li>Desirable, but not critical</li> </ol>

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### Key Issues-Practical

Issue/observation	Practical solution/Observation
Order Dependence	Use Reference portfolio
Scale (Share ) dependence of portfolio methods	Price initially at highest authorized share
Co-VaR instability	Average over events in neighborhood
Portfolio dependent methods may promote de-worsification	Consider alternative approaches or minimum ROL risk load charges.
"Pure" risk measures may lead to very small risk loads.	Use impure risk measure – for example Co-TVaR instead of XC0-TVaR or add minimum ROL risk load.

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### Observations and Conclusions

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- “ Target return on required capital is the basis for reinsurer pricing indications.
- “ Debate is over required capital.
- “ A profusion of methods and approaches
- “ Tail focus and portfolio dependence are key areas where methods differ
- “ Some of the key methods used in practice do not satisfy all the desired conceptual properties and may have led to deworsification.

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