

Estimating Minimum & Maximum Values

Perhaps the most common method of uncertainty analysis used today is where the FIRST step is to elicit Minimum & Maximum values directly from an expert based upon her Most-Likely value.

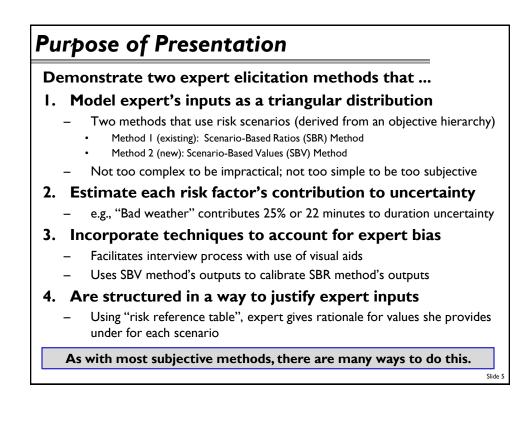
The 2 scenario-based methods presented herein take an alternative approach where the FIRST step is to elicit "risk scenarios" that enable an expert to describe risks & risk intensities that occur in typical, optimistic and pessimistic scenarios.

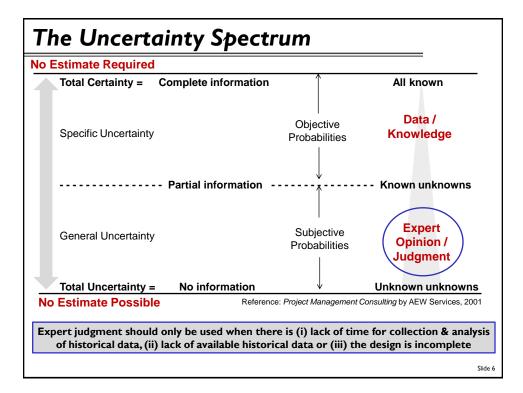
By having such scenarios already described, we now have (i) a justification for what risk factors contribute to the uncertainty and (ii) a means to estimate to what extent each risk factor "drives" the uncertainty in order to estimate Minimum & Maximum values.

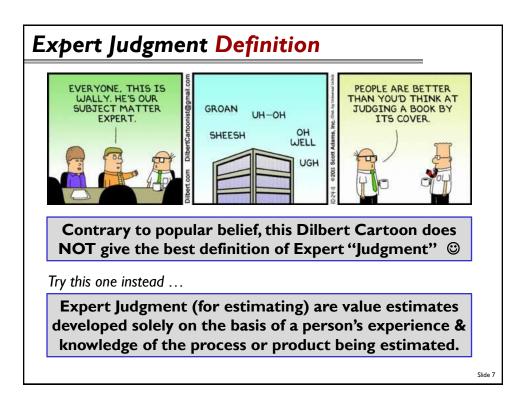
Slide 3

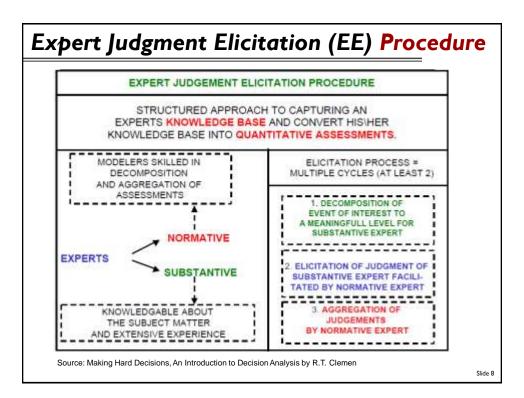
Outline

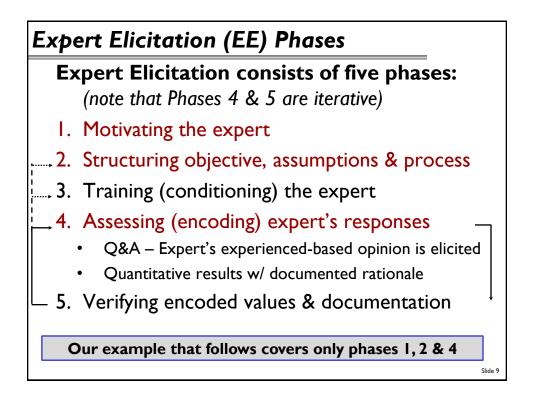
- Purpose of Presentation
- Background
 - The Uncertainty Spectrum & Expert Judgment Elicitation
 - Five Expert Elicitation (EE) Phases
- Case Study: Estimate Morning Commute Time
 - Establish Framework of Interview Session
 - Create Objective Hierarchy
 - Brainstorm Risk Factors then Create "Risk Reference Table"
 - Includes descriptions of each Risk Factor
 - Method I: Scenario-Based Ratios (SBR) Method
 - Method 2: Scenario-Based Values (SBV) Method
 - Suggested use of SBR and SBV Methods in Practice
- Conclusion & Potential Improvements / Future Work

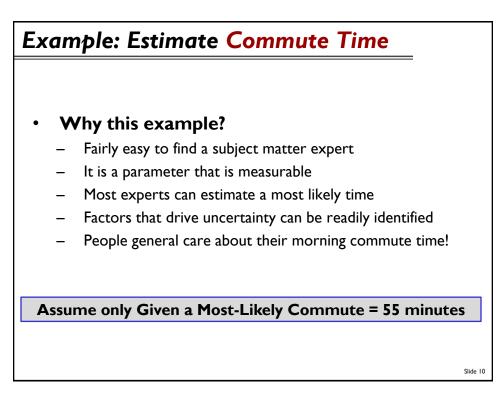












Establish Framework of Interview Session

I. Motivating the expert

- Explain the importance & reasons for collecting the data
- Explore stake in decision & potential for motivational bias

2. Structuring objective, assumptions & process

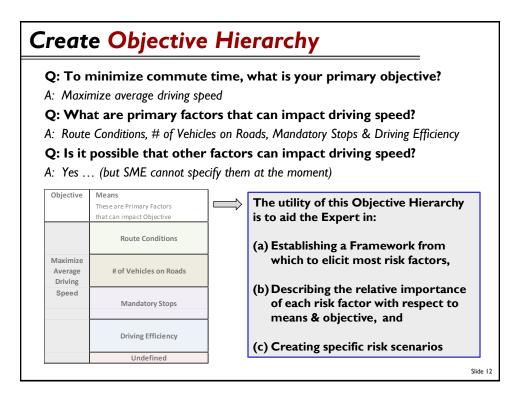
- Must be explicit about what you want to know & why you need to know it
 - Clearly define variable & avoid ambiguity and explain data values that are required (e.g. hours, dollars, %, etc)

You should have worked with SME to develop the Objective and up to 5 Major Assumptions in the table below

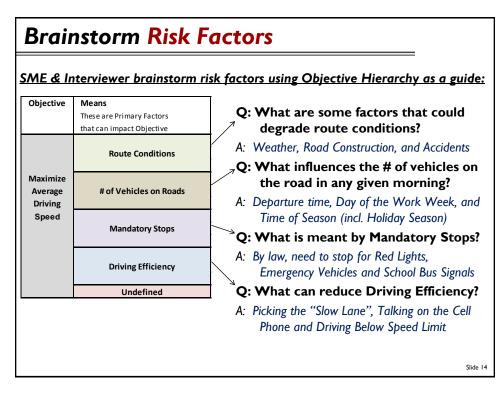
<u>Objective</u>: Develop uncertainty distribution associated with time (minutes) it will take for your morning commute starting 1 October 2014.

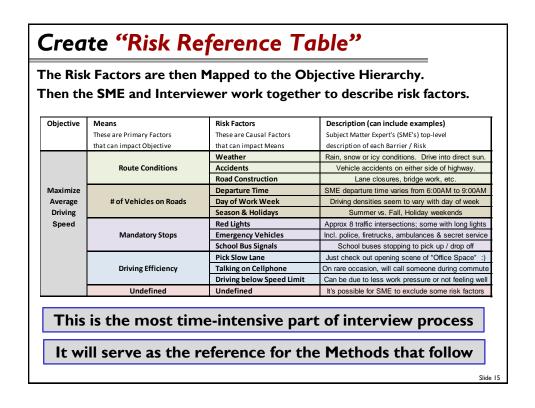
Assumption 1: Your commute estimate includes only MORNING driving time Assumption 2: The commute will be analogous to the one you've been doing Assumption 3 Period of commute will be from 1 Oct 2015 thru 30 Sep 2016 Assumption 4 Do not try to account for extremely rare & unusual scenarios Assumption 5: Unless you prefer otherwise, time will be measured in minutes

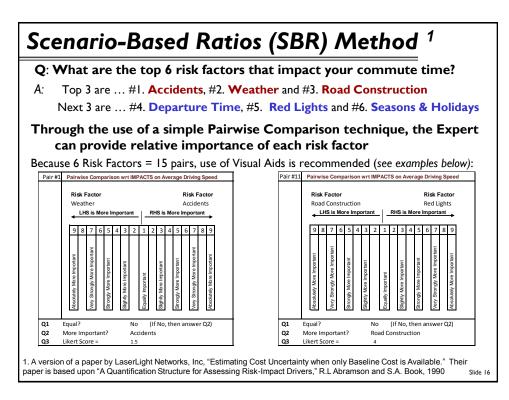
Slide 11







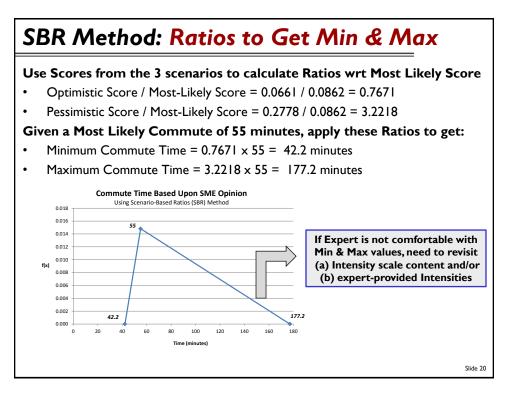




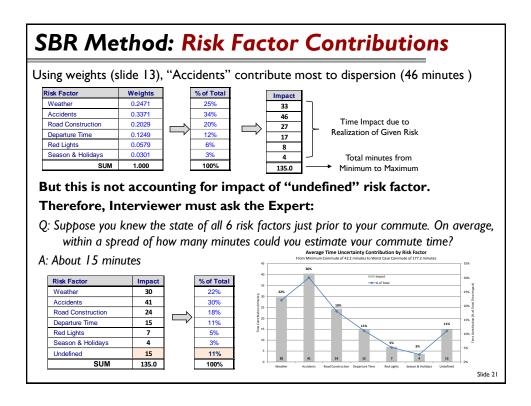
aw P/W Weiahtina	Weather	Accidents	Road Construction	Departure Time	Red Lights	Season & Holidays			
Weather	weather	2/3	1 1/2	2	4	Rolldays 8			
Accidents	1 1/2	2/3	2	2 1/2	6	9			
Road Construction	2/3	1/2	1	2 1/2	4	7			
Departure Time	1/2	2/5	1/2	1	2	5			
Red Lights	1/4	1/6	1/4	1/2	1	2			
Season & Holidays	1/8	1/9	1/7	1/5	1/2	1			
-	4.0	2.8	5.4	8.2	17.5	32.0			
Sum									
Rank Rank The raw values Normalized Matrix	2	1 nalized t Accidents	3 O a 100% Road Construction	Departure	5 nen sumn Red Lights	6 ned to V Season & Holidays	Veig	hts pe _{Weights}	r Risk Factor:
_{Rank} The raw values	are norn	nalized t	o a 100% Road	scale, tl	nen sumn	ned to V Season &	Veig		r Risk Factor:
Rank The raw values Normalized Matrix	2 are norm Weather	nalized t	O a 100% Road Construction	Departure Time	nen sumn Red Lights	ned to V Season & Holidays	Veig	Weights	
Rank The raw values Normalized Matrix Weather	2 are norm Weather 0.247	Accidents	o a 100% Road Construction 0.278	Departure Time	Red Lights	ned to V Season & Holidays 0.250	Veig	Weights 0.2471	→ Accidents have
Rank The raw values Normalized Matrix Weather Accidents	2 are norm Weather 0.247 0.371	Accidents 0.234 0.352	o a 100% Road Construction 0.278 0.371	Departure Time 0.244 0.305	Red Lights 0.229 0.343	ned to V Season & Holidays 0.250 0.281	Veig	Weights 0.2471 0.3371	→ Accidents have the biggest
Rank The raw values Normalized Matrix Weather Accidents Road Construction	2 are norm 0.247 0.371 0.165	Accidents 0.234 0.352 0.176	o a 100% Road Construction 0.278 0.371 0.185	Scale, tl Departure Time 0.244 0.305 0.244	Red Lights 0.229 0.343 0.229	ned to V Season & Holidays 0.250 0.281 0.219	Veig	Weights 0.2471 0.3371 0.2029	→ Accidents have the biggest impact (34%) o
Rank The raw values Normalized Matrix Weather Accidents Road Construction Departure Time	2 are norm 0.247 0.371 0.165 0.124	Accidents 0.234 0.352 0.176 0.141	o a 100% Road Construction 0.278 0.371 0.185 0.093	Scale, tl Departure Time 0.244 0.305 0.244 0.122	Red Lights 0.229 0.343 0.229 0.114	ned to V Season & Holidays 0.250 0.281 0.219 0.156	Veig	Weights 0.2471 0.3371 0.2029 0.1249	→ Accidents have

reate <u>Intensi</u>	ty Scale	<u>for 6</u> r	risk fact	ors that	: impac	t comn	nute	time	
Intensity Scale	Weather	Accidents	Road Construction	Departure Time	Red Lights	Season & Holidays	ſ	Value	Norma
Low	Perfect	None	None	< 7:00AM	No lights	Never		1	0.061
Medium-Low	Some wind	Evacuated car on side of road	Shoulder work at 1 location	7:15AM	1 light	Rarely		1.5	0.091
Medium	Some rain	1 accident on shoulder	Shoulder work at 2 locations	7:30AM	2 lights	Half of commutes		2	0.121
Medium-High	Rain & Wind	2 accidents on shoulder	1 of 3 lane closures	8:00AM	3 lights	More than half of commutes		3	0.182
High	Rain & Snow	Accident shutting 1 lane	2 of 3 lane closures	8:15AM	4 lights	>75% of commutes		4	0.242
Very High	Snow & Wind	Accident shutting 2 lanes	Temporary road closure	8:30AM	>4 lights	Nearly Always		5	0.303
Expert provic	les "int _{Weather}	ensity"	Road Construction	or each Departure Time	risk fac	C tor in Season & Holidays	each	scena	rio
Most Likely Intensities	Medium-Lov	Low	Medium-Low	Medium	Medium	Medium-Low		Typical co	mmute
Optimistic Intensities	Low	Low	Low	Medium-Low	Medium-Low	Low		Best case	
Pessimistic Intensities	Very High	Very High	High	High	High	High	\rightarrow	Worst cas	se commu

Scenario Intensities	Weather	Accidents	Road	Departure Time	Red Lights	Season & Holidays	g inputs
Most Likely Intensities	Medium-Low	Low	Medium-Low	Medium	Medium	Medium-Low	► Typical commute
Optimistic Intensities	Low	Low	Low	Medium-Low	Medium-Low	Low	Best case commuter
Pessimistic Intensities	Very High	Very High	High	High	High	High	→ Worst case com
•	d by res each Sc	spectiv enario	e risk fa				intensity scale, le 13) to produ
hen multiplie	d by res	spectiv enario	e risk fa 	0.1249		(ref. slid	•
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hen multiplie "Score" for o	d by res each Sc Risk Factor	weights:	e risk fa 0.2029 Road	0.1249 Departure	eights (0.0579	(ref. slid	le 13) to produ
hen multiplie "Score" for Scenario Intensities	d by res each Sc Risk Factor 0.2471 Weather	Weights: 0.3371 Accidents	e risk fa	0.1249 Departure Time	0.0579 Red Lights	0.0301 Season & Holidays	le 13) to produ



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Scenario-Based Values (SBV) Method Using the Risk Reference Table (Slide 15) ... 1. Get Expert to talk about risks she experiences during "typical" commute scenario. Then ask her to provide time impacts associated with each risk she experiences. Result: 6 discrete time impacts associated with each of 6 risk factors 2. Get Expert to talk about risks she experiences during a worst case commute scenario (Worst Case #1). Then ask her to provide time impacts associated with each risk she experiences. Helpful Hint: Use her "Most Likely" results as a reference. Result: 9 discrete time impacts associated with each of 9 risk factors 3. Get Expert to talk about risks she experiences during another worst case commute scenario (Worst Case #2). Then ask her to provide time impacts associated with each risk she experiences. Helpful Hint: Use "Worst Case #1" results as a reference. Result: 11 discrete time impacts associated with each of 11 risk factors 4. Sum up Time Impacts of Each Scenario Use Step 4 results to Determine Minimum and Maximum commute times. 5. For Minimum, the Sum is subtracted from the Most-Likely commute time.

- For Maximum, the Sum is added to the Most-Likely commute time.
- 6. Select the Higher Maximum value of the Two Worst Case Scenarios.
- 7. Display Triangular Distribution associated with Minimum, Most-Likely and Maximum values.
- 8. Display **contribution of risk factors** to uncertainty (in minutes and %).
- 9. Iterate back through Steps 1 8 as necessary based upon Expert's feedback on output.

Slide 22

6 risk	factors impact m	ost-likely comn	nute time		
Given Assum Assum Assum	by Expert: Most-Likely Co e you drive same route in e you are NOT driving in e you will turnaround or "s	ommute Time = 55 mir morning; no MAJOR c extreme (dangerous) we stop" commute if forese	utes letours & no random stops (e.g. to	iour comm	ute).
Objective	Means	Risk Factors Most Likely or Typical Scenario		Most Likely Impact	Most Likely Rank
objective	These are Primary Factors	These are Causal Factors	What SME experiences on a typical	SME guess on	Top risks
	that can impact Objective	that can impact Means	morning commute	on time added	impacting
		,		to Most Likely	Objective
				(in minutes)	
		Weather	Dry conditions w/direct sun, Occasional rain	2	3
	Route Conditions	Accidents	No accidents on a typical commute	0	
		Road Construction	Occasional shoulder work	3	2
Maximize		Departure Time	Depart near start of rush hour (7:30 - 7:45am)	5	1
Average	# of Vehicles on Roads	Day of Work Week	(Not applicable)	0	
Driving		Season & Holidays	(Not applicable)	0	
Speed		Red Lights	Typically 'catch' 2 "long" red lights	3	2
	Mandatory Stops	Emergency Vehicles	Typcially no emergency vehicles en route	0	
		School Bus Signals	Typically no stops needed for school bus	0	
		Pick Slow Lane	Minor issues (Several lanes are "equally" bad)	1	4
	Driving Efficiency	Talking on Cellphone	No calls in morning	0	
		Driving below Speed Limit	Drive with flow of traffic	0	
	Undefined	Undefined	Undefined	1	4
		*	Impact versus MIN commute time =	15	minutes
		/	Subtract from MOST LIKELY commute =	55	minutes

SBV Method: Worst Case Scenario I

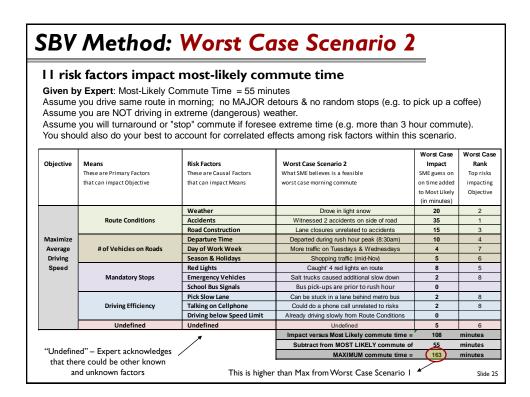
9 risk factors impact commute time for this worst case scenario

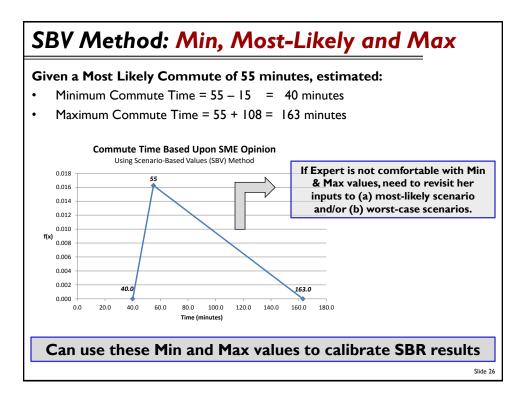
Given by Expert: Most-Likely Commute Time = 55 minutes

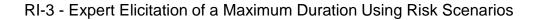
Assume you drive same route in morning; no MAJOR detours & no random stops (e.g. to pick up a coffee) Assume you are NOT driving in extreme (dangerous) weather.

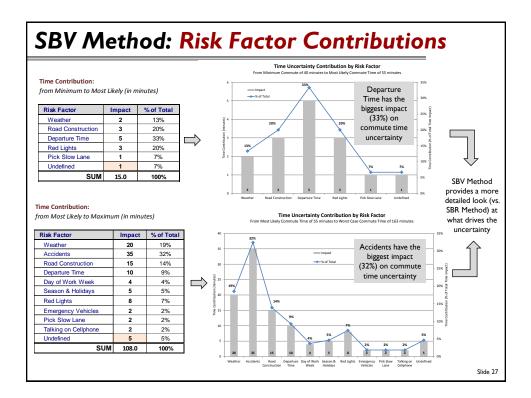
Assume you will turnaround or "stop" commute if foresee extreme time (e.g. more than 3 hour commute). You should also do your best to account for correlated effects among risk factors within this scenario.

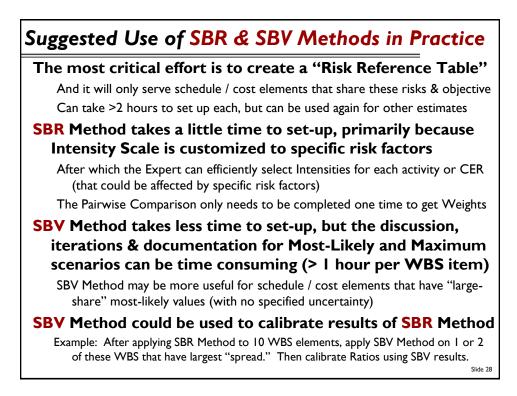
				Worst Case	Worst Case
Objective	Means	Risk Factors	Worst Case Scenario 1	Impact	Rank
	These are Primary Factors	These are Causal Factors	What SME believes is a feasible	SME guess on	Top risks
	that can impact Objective	that can impact Means	worst case morning commute	on time added	impacting
				to Most Likely	Objective
				(in minutes)	
		Weather	Drove in heavy rain; likely led to accident	15	2
	Route Conditions	Accidents	Severe accident that shut 2 lanes	50	1
		Road Construction	Lane closures on bridge due to accident	0	
Maximize		Departure Time	Depart during rush hour peak (8:30am)	10	3
Average	# of Vehicles on Roads	Day of Work Week	More traffic on Tuesdays & Wednesdays	4	6
Driving		Season & Holidays	Shopping traffic (mid-Nov)	5	5
Speed		Red Lights	Caught' 4 red lights en route	8	4
	Mandatory Stops	Emergency Vehicles	Had to pull over for 2 emergency vehicles	2	7
		School Bus Signals	Bus pick-ups are prior to rush hour	0	
		Pick Slow Lane	Can be stuck in a lane behind metro bus	2	7
	Driving Efficiency	Talking on Cellphone	If accident, typically will make phone call	0	
		Driving below Speed Limit	Already driving slowly from Route Conditions	0	
	Undefined	Undefined	Undefined	5	5
		1	Impact versus Most Likely commute time =	101	minutes
"Undef	ined" – Expert acknowledges		Add to MOST LIKELY commute =	55	minutes
	here could be other known	<i>,</i>	MAXIMUM commute time =	156	minutes
inde e	and unknown factors				Slide











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Conclusion

• Demonstrated two expert elicitation methods that modeled expert's inputs as a triangular distribution

- Started with only one numeric value: Most-Likely Commute = 55 minutes
- Method I (existing): Scenario-Based Ratios (SBR) Method
- Method 2 (new): Scenario-Based Values (SBV) Method
- Each method focused <u>first</u> on describing Risk Scenarios
 - A "Risk Reference Table" was created from which the expert described
 - relative importance and intensity of each risk factor (SBR Method), or
 - how each risk impacts ideal commute time (SBV Method)
- Each method measured risk factor impacts on uncertainty
 - e.g., "Accidents" contributes 34% or 41 minutes to duration uncertainty

Incorporated techniques to account for expert bias

- Facilitates interview process with use of visual aids
- Recommends using SBV method outputs to calibrate SBR method outputs
- Are structured in a way to justify expert inputs

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Potential Improvements / Future Work

- Develop standardized NASA system objective hierarchies – Example: One for Satellites, One for Rockets, One for Aircraft, etc.
- Develop risk factor "sets" for each objective hierarchy – Example: A satellite objective hierarchy may have 3 sets depending on estimate type
- Improve method of weighting risk factors
- Improve intensity tables that depict expert judgment – Example: Make less subjective using pairwise comparison method
- Develop step-by-step templates for SBR & SBV methods
 Example: Something along the lines of a 1040 EZ form
- Provide criteria when to elicit mean or median (vs mode)
- Incorporate methods to combine expert judgments
- Demonstrate how elements of SBR and SBV methods can augment output of data-driven CERs

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