

Broadleaf
Creating value from uncertainty
www.broadleaf.co.nz

Quantitative risk analysis

Mike Wood

1

Broadleaf

© Copyright Broadleaf Capital International NZ Limited, 2016

BROADLEAF CAPITAL INTERNATIONAL NZ Limited

PO Box 57159, Mana, Porirua 5247, New Zealand
Tel: +64-4-233 9864 Fax: +64-4-233 9860
Wood@broadleaf.co.nz
www.broadleaf.co.nz

This document contains substantial pre-existing Intellectual Property of value to Broadleaf Capital International NZ Limited (Broadleaf).

It is provided by Broadleaf for information, but is not to be sold, used for commercial purposes, licensed or otherwise transferred, whether in its original form or as part of any further development that recipients might undertake, without Broadleaf's prior agreement.

Quantitative risk analysis
2

Broadleaf

Characterising uncertainty

Broadleaf

A project risk register is the usual tool for capturing risks, their analysis, and what is being done about them where necessary.

Its focus is on individual risks – you cannot determine from it how risky the project is in terms of aggregate cost, benefit or schedule impacts

Quantitative risk analysis
4

Broadleaf

Principles

Quantitative risk assessment using tools such as Monte Carlo simulation can characterise risk in the aggregate

The purpose of the analysis is to understand the range of outcomes the project might face

Quantitative cost and/or schedule risk analysis now very common in the large project environment

The aim is realism rather than an illusion of accuracy

Uncertainty may be uncomfortable but we need to understand it

Quantitative risk analysis
5

Broadleaf

Background

Broadleaf

Reasons for using QRA in our projects

1. **Helps lift the quality of investment analysis and advice**
(in CBA, costs tend to be understated and benefits overstated)
2. **Providing fiscal advice (e.g. around financial recommendations)**
QRA helps answer the following questions:
 - Where do the figures come from?
 - What do they mean?
 - How much confidence should the decision maker place in them?
 - Where should we target our monitoring/ risk management efforts?

Indicative annual spending profile	SM – increase				
	2014/15 ⁴	2015/16	2016/17	2017/18	2018/19 ⁵
Operating	\$13.1	\$13.1	\$18.6	\$48.5	\$17.6
Capital	\$0.55	\$4.1	\$3.2	\$0.1	\$0.00

3. **It's part of BBC method (part of Cabinet expectations)**
(QRA of costs is mandatory as part of the development of a DBC for high risk or major projects, or programmes monitored by the Treasury)

Broadleaf

QRA's should be considered even when they are not required by the Better Business Cases framework

- Provides a much better contingency estimate than a flat percentage
- Given that a lot of project risk lies in the plan, schedule QRAs should be being used more widely
- The QRA process itself highlights risks that often don't appear in project risk registers

Quantitative risk analysis

2

Broadleaf

What a QRA won't do....

- Treat the risks
- Accommodate changes such as a fundamental change in scope
- Assist when you are "flying blind" (unaware of what the risks are)

Quantitative risk analysis

2

Broadleaf

Quality management and risk management

- Applying quality management techniques is one of the ways of treating (modifying) the risks of not achieving the standards or objectives that are the measures of success
- The tighter the specification (or the more challenging the objective), the higher the risk of not achieving it
- QRAs dispel the fiction that we can specify the cost, benefits, duration etc with 100% accuracy before the project starts
- Quality assurance is a “third line of defence” risk management tool – it increases the likelihood of the project or programme outcomes being achieved, through structured reviews of processes, practices, procedures etc and the way they are applied to the project or programme

10

Broadleaf

Background

1. Components of an estimate
2. Sources of uncertainty
3. Historical developments

Quantitative risk analysis
11

Broadleaf

Background 1: Components of an estimate

Quantitative risk analysis
12

Broadleaf

Direct and indirect costs

Direct costs

- Usually developed in an estimating package
- Typically follow a Work Breakdown Structure (WBS)
- Quantities and rates for some items
- Some lump-sum items

Indirect costs

- Project management, preliminaries, mobilisation and demobilisation, overheads
- Margin

Quantitative risk analysis
13

Broadleaf

Fixed and variable costs

These must be separated if there is schedule uncertainty

Fixed costs remain fixed, irrespective of the schedule

- Most direct costs are fixed under many forms of contract

Variable costs increase as the schedule increases

- Indirect costs have large variable components
- Because variable costs are often large, schedule uncertainty can be a dominant driver of overall cost

Quantitative risk analysis
14

Broadleaf

Cash flow and escalation

Cash flows are important in most major projects

- They are needed for escalation calculations
- They determine funding requirements and draw-downs

Schedule uncertainty is a major driver of uncertainty in cash flow and escalation

Quantitative risk analysis
15

Broadleaf

Background 2: Sources of uncertainty

Quantitative risk analysis
26

Broadleaf

Continuous uncertainties

Most elements of an estimate are subject to uncertainty

- Rates can rarely be known in advance, as final contracts can't be signed before approval
- Productivities of labour and equipment vary according to site conditions and other factors
- Quantities may be uncertain because designs are not finalised

These uncertainties are usually 'continuous'

- There are ranges across which they may vary, without big or discrete changes

Quantitative risk analysis
27

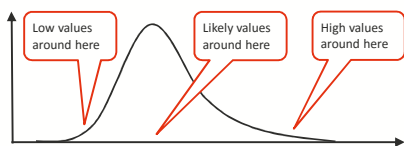
Broadleaf

Representing continuous uncertainties

Continuous uncertainties are usually represented as distributions

They are often characterised by three-point estimates

- Low, likely and high values
- A 'standard' shape assumption is usually made



Quantitative risk analysis
28

Broadleaf

Discrete risks

Discrete risks are events that may or may not happen

- Usually there are quite different impacts if the event arises compared to no-event

Discrete risks are developed in a risk register

In practice, there should be very few discrete risks

- Risk treatment actions should be in place
- Major threats are usually covered by insurance, or by specific contractual terms and conditions

If a project has a long list of discrete risks, watch out!

Quantitative risk analysis
19

Broadleaf

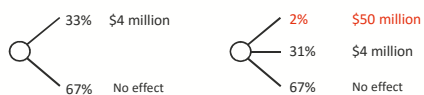
Representing discrete risks

Discrete risks are usually represented as probability trees

The simplest have only two branches: the event occurs or it doesn't

More interesting circumstances require several branches

The consequences may be represented as distributions



Quantitative risk analysis
20

Broadleaf

Schedule uncertainty

For important or long-duration projects, schedule uncertainty is best developed in a separate quantitative analysis

Cost and schedule uncertainty are linked

- Productivity affects the schedule
- The schedule affects variable costs and escalation

Schedule uncertainty covers

- Uncertainty in the start date (e.g. due to approval delays)
- Uncertainty in the project's elapsed time to completion

Quantitative risk analysis
21

Broadleaf

Background 3: Historical development

Quantitative risk analysis
22

Broadleaf

Methods of assessing contingency

Model structures

- Risk events
- Line items in the estimate
- Risk factors

Calculation

- Manual
- Computer assisted
- Monte Carlo simulation with distributions



Quantitative risk analysis
23

Broadleaf

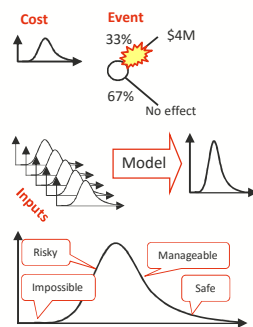
Monte Carlo simulation

Very brief summary

Distributions represent values and probabilities represent events

Thousands of examples of possible outcomes – sampling distributions and calculating outcomes






Interpret the results as an indication of what could happen in reality




Quantitative risk analysis
24

Broadleaf

Risk event models: all the risks

Risk	Probability	Impact	P x I
Risk 1	P ₁		P ₁ x I ₁
Risk 2	P ₂		P ₂ x I ₂
Risk 3	P ₃		P ₃ x I ₃
Risk 4	P ₄		P ₄ x I ₄
...
Risk n	P _n		P _n x I _n
Total			$\Sigma P_i \times I_i$






Monte Carlo simulation




Quantitative risk analysis
25

Broadleaf

Line item models

WBS Item	Labour	Materials	Total	Contingency
Axxxx	\$	\$	\$	
Bxxxx	\$	\$	\$	
Cxxxx	\$	\$	\$	
Dxxxx	\$	\$	\$	
...
Zxxxx	\$	\$	\$	
Total			$\Sigma \$$	$\Sigma \$$

Monte Carlo simulation




Quantitative risk analysis
26

Broadleaf


Risk factors model

Cost estimating relationships (e.g. Cost = Quantity x Unit rate)

Simulated cost = Base estimate x (1 + ΔQuantity) x (1 + ΔRate)


 Uncertainty about quantities of concrete (m³)

Project estimate summary							
Labour	Facilities	Supp- vision	Materials	Sub- contracts	Services	Expenses	Total
Earthworks							?
Concrete							?
...							?
Overheads							?
Project Total	?	?	?	?	?	?	?


 Uncertainty about rates for cost of concrete (\$/m³)

The only practical way to evaluate a risk factor model is to use Monte Carlo simulation on a computer

Quantitative risk analysis
27

Broadleaf

Why the risk factor approach?

Problems with risk event models

Many risks are not really events but variations from the estimating assumptions – vary continuously across a range

- Staff productivity
- Rates for labour, office space, equipment hire
- Quantities of anything that is to be purchased
- How long the work will go on and incur overheads

Some risks affect more than one part of the cost

One part of the cost will be affected by more than one risk

Quantitative risk analysis
28

Trying to represent uncertainties as discrete, separate events is inefficient and confusing

Broadleaf

Correlation in line item models

Broadleaf

Sources of correlation and linkages

Correlated: all high or all low together

- Development size uncertainty affects a number of cost items
- Labour cost uncertainty affects every item with labour content

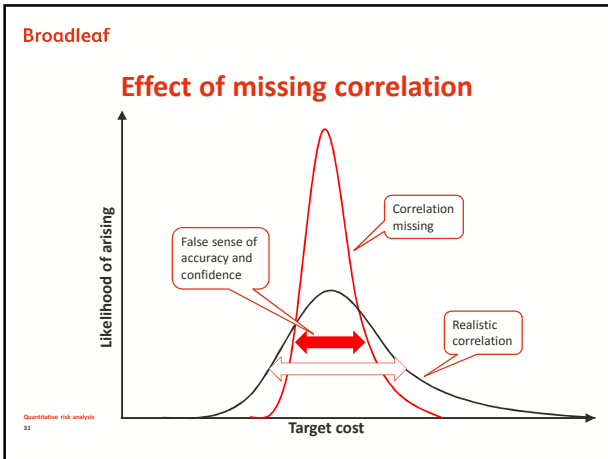
Proportional, e.g.,

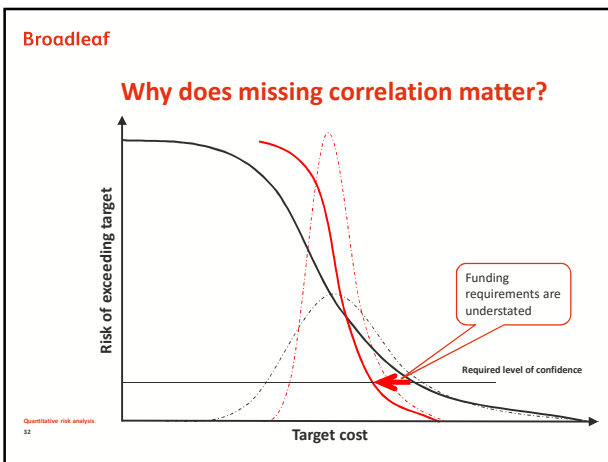
- Preliminaries = 24% of direct costs
- Contractor's overhead = 13% of direct costs plus preliminaries
- Maintenance = 10% of purchase price

Common cause

- Costs driven by schedule (e.g. project management effort, overheads)

Quantitative risk analysis
29





Broadleaf

Why is correlation important?

Separate lines are often not independent of one another

In practice, line item uncertainties are correlated

- In principle, it is technically feasible to model the correlations
- Realistically, it's problematic in a line item structure

Line item models often either:

- Understate the uncertainty in the total cost, because they ignore correlation, or
- Lack credibility, because they rely on correlations that cannot be justified

Quantitative risk analysis 33

Broadleaf

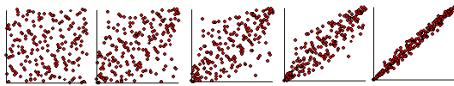
It is hard to estimate correlation

Few people have a sound understanding of correlation

It is a statistical concept most often used to describe historical data rather than for prediction

- For most projects we don't have useful data for this

It often becomes a vague factor that is adjusted to get an outcome that 'looks right'



Quantitative risk analysis
34

Broadleaf

Dealing with linkages between items

- Identify all major sources of dependence links
- Estimate correlations directly, or
- Modify your model structure

Quantitative risk analysis
35

Broadleaf

Defining distributions and estimating parameters

Broadleaf

Assessing individual ranges – pitfalls

Quantitative risk analysis
37

Broadleaf

Anchoring and adjustment bias

Once our minds have focused on one value, it is difficult to move away

- The first value becomes the anchor
- Subsequent estimates are adjustments from the anchor
- Typically the adjustments are not large enough

If we start from the centre and work out we tend to understate the range

Quantitative risk analysis
38

Broadleaf

Avoiding anchoring

Work in from the extremes rather than out from the centre

The extremes may be difficult to estimate but they help us think about the true range we might face

- They are a valuable part of the *process* even if they are not reliable for modelling

Explore the issues at work before fixing on any numbers

Quantitative risk analysis
39

Broadleaf

Estimating the spread

The extreme values are rare

- You might never see a 1:100 event let alone 1:1000
- Minimum and maximum estimates are unreliable
- Using them to define a distribution may not produce a reliable forecast

However, we do see 1:10 events and can estimate them more reliably

Quantitative risk analysis
40

Broadleaf

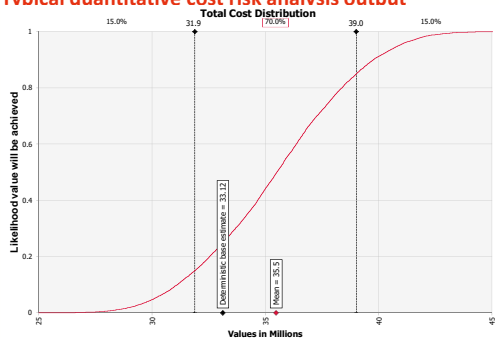
Recommended approach



Quantitative risk analysis
41

Broadleaf

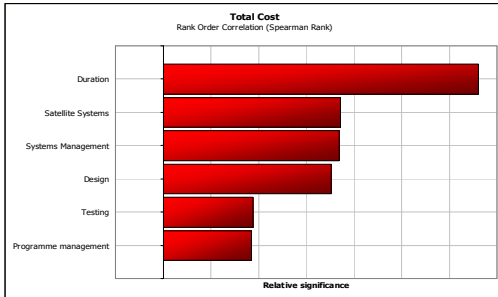
Typical quantitative cost risk analysis output



Quantitative risk analysis
42

Broadleaf

Quantitative risk analysis – sensitivity analysis



Quantitative risk analysis
43

Broadleaf

Schedule uncertainty

Quantitative risk analysis
44

Broadleaf

Schedule uncertainty affects the costs

The estimate is based on a planned schedule

Fixed costs

- Fixed costs are spread over the uncertain project duration using a standard S-curve

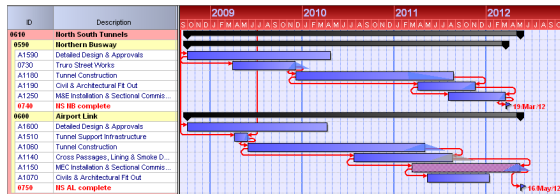
Variable costs

- A variable cost rate is calculated from the planned duration (assumed constant over the project life)
- Variable costs increase or decrease in proportion to the actual duration

Quantitative risk analysis
45

Broadleaf

Model

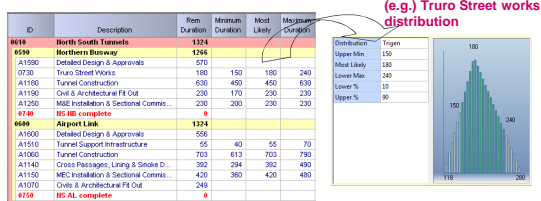


Simplified model focuses on major tasks
 SS and FF links often required at this level
 Some tasks can be left out – never the critical

Quantitative risk analysis
 46

Broadleaf

Uncertainties

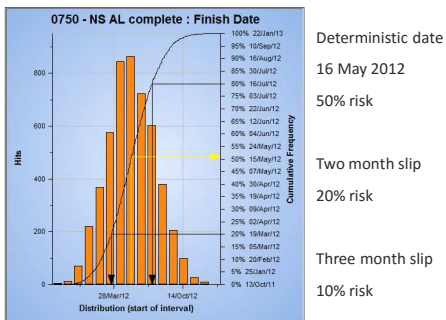


Optimistic and pessimistic duration estimates
 Distributions instead of fixed durations

Quantitative risk analysis
 47

Broadleaf

Milestone date distribution

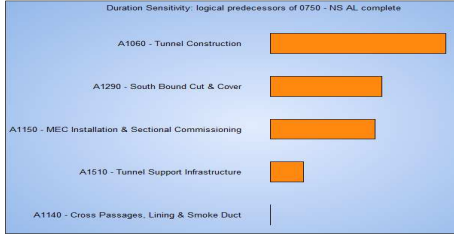


- 100% 22/Jan/13
- 95% 19/05Apr/12
- 90% 16/04Apr/12
- 85% 30/Jul/12
- 80% 16/Jul/12
- 75% 03/Jul/12
- 70% 22/Jul/12
- 60% 12/Jul/12
- 60% 04/Jul/12
- 55% 24/May/12
- 50% 15/May/12
- 45% 07/May/12
- 40% 30/Apr/12
- 35% 19/Apr/12
- 30% 09/Apr/12
- 25% 02/Apr/12
- 20% 19/Mar/12
- 15% 05/Mar/12
- 10% 20/Feb/12
- 5% 25/Jan/12
- 0% 13/02/11

Quantitative risk analysis
 48

Broadleaf

Milestone date uncertainty



Sensitivity = spread of outcomes, not total duration

Quantitative risk analysis
49
