



Analogies: Techniques for Adjusting Them

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- **Background**
- **The current method**
- **Two new methods**
 - Borrowed slope
 - Relational correlation
- **Conclusion**

Background

- **Considerable attention is devoted to techniques in the development of Cost Estimating Relationships (CERs) for parametric estimating**
 - Research on CERs
 - Methods for calibrating
- **Considerable expertise is to be found in buildup techniques**
 - Many Original Equipment Manufacturers (OEMs) have large cost shops which practice buildup
- **Analogy, on the other hand, has been given little attention**
- **Next, some basic definitions ...**

Definitions

- **Parametric Estimates: Estimates made by developing statistical “Cost Estimating Relationships” (CERs) based on one or more parameter and cost**
 - Estimates involving parameters but not based on statistical analysis are more properly called either “adjusted analogies” or “adjusted buildups”
- **Analogies: Estimation by assuming that the costs of a new system will be equal to (or similar to) the costs of a system that is similar**
 - “Adjustments” are almost always made
- **Buildups: Physical Bill of Materials (BOMs) and CAD-generated material lists and the like**
 - We do not mean “buildups” consisting entirely of [Staffing levels*Duration](#). Such estimating techniques are little more than “engineering judgment” in fine detail
 - Buildups often include “adjustments” to allow for size differences
- **Composite methods: A method that involves at least two of the three other types**
- **Adjustments: Scaling of a cost by some physical, performance, or other such attribute**
 - Scaling is usually directly proportional to the attribute
 - Scaling parameters are usually countable or measurable and intuitively tied to cost

The Current Method

- **Adjustments, in the analogy or buildup method, typically rely on an “obvious” characteristic**
 - The characteristic is most often weight
 - Sometimes weight of the new system is not known, and so another characteristic is used (often as a proxy for weight)
 - Sometimes a characteristic such as bore diameter of a gun is used
- **Usually the ratio of the values of the characteristic in the new system to the value in the old system is multiplied by the cost of the old system**
 - Sometimes called “j-ing up the estimate”
- **Sometimes the characteristic is transformed in a way that is thought to make it proportional to weight**
 - E.g., the bore diameter of a gun, is cubed
 - In these cases, there may be a presumed relationship to weight,

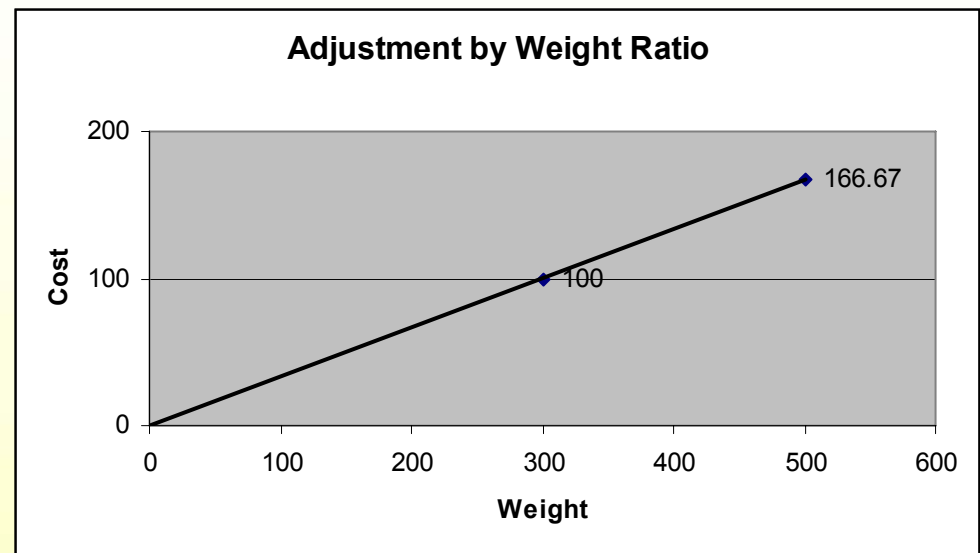
- **An example adjustment by ratio is:**
 - The analogy weighs 300 tons and costs \$100M
 - The new system weighs 500 tons and so is assumed to cost $(500/300)*\$100M = \$166.67M$
- **This is a typical and familiar adjustment**
 - What is its implication?
 - Should we be inclined to believe it?
 - Is it in accord with what we believe?

... let's look at a graph to see what it implies ... there is a surprise there for most of us ... but first, force yourself to predict what the line between the analogy and the prediction looks like ... where does it cross the y axis?

- **The below graph shows the previous adjustment**
 - The analogy weighs 300 tons and costs \$100M
 - The new system weighs 500 tons and is assumed to cost $(500/300)*\$100M = \$166.67M$
 - Note that the line through the 2 points passes through the origin

Important Observation:
Straight adjustments by ratios
***always* pass through the origin!**
Most observers fail to predict
that, even though it is
straightforward to show that it
must.

Important Question:
Is this reasonable?



- **The y-intercept is a litmus test among cost estimators. There are about three schools of thought:**
 1. CERs “should” pass through the origin
 2. CERs which do not pass through the origin must have an explicable y-intercept
 3. CERs must be statistically derived, and if done properly, the y-intercept is just “what it is”
- **We’ll discuss each briefly and then assume you are of school 2 or 3**



Warnings:

- 1- Almost anyone is from one of these schools of thought at heart. The writers are no exception.
- 2- The gulf between these schools is wide.

- **Typical arguments**

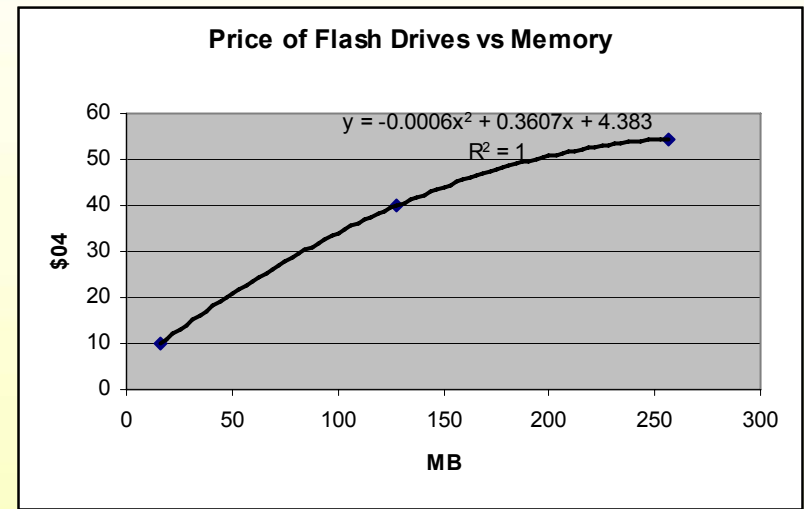
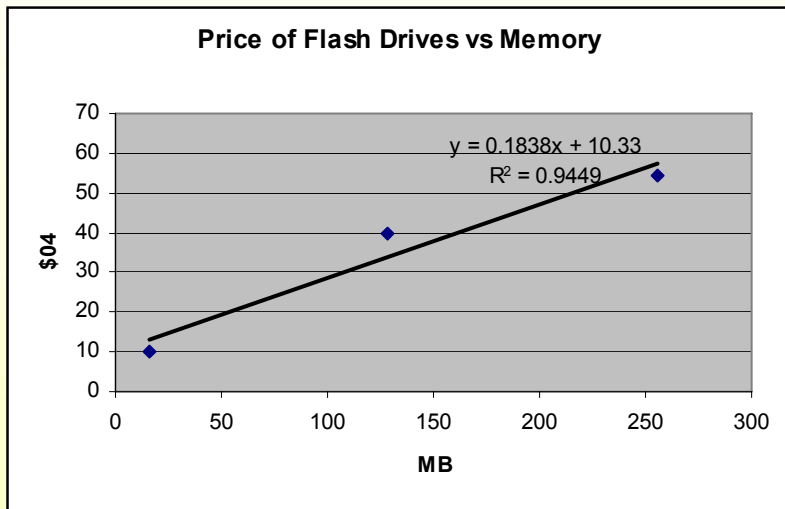
- “If I spend no money, I get no product”

- **Pros:**

- Sounds good

- **Cons:**

- Doesn't seem to match the data. E. g., the price of FlashDrives:



- **Typical arguments**
 - “There must be physics-based arguments for CERs”
- **Pros:**
 - Helpful to think about it, within reason
- **Cons:**
 - If practiced to the extreme, good CERs can be rejected just because we do not yet understand them
 - Engineers, who hate cost estimation, can usually talk the analyst to a full stop

- **Typical arguments**

- We are not trying to predict the y-intercept. We are trying to predict the cost of systems of non-zero size.
 - We should take the best advice the data can give us
 - We should extrapolate as little as we can
- If the data show that the y-intercept is non-zero, we should not reject a CER just because we do not know why
 - Galileo believed the data, even absent a theory of gravity. It took centuries before Isaac Newton knew why – but Isaac Newton wouldn't even have wondered without Galileo showing that there was an explanation missing.
 - This approach is what the practice of statistics currently recommends

- **Pros:**

- Any existing system (i. e., one of the data points underlying the CER) is well-predicted

- **Cons**

- If the analysis is not well done, there may be a better CER

- **Borrowed slope¹ – a variant of the methods for calibrating CERs**
 - Adjust a “trusted analogy” by a “trusted slope”
- **Relational Correlation² – taking advantage of the geometry of regression**
 - Adjust a “trusted analogy” by a “best guess slope”

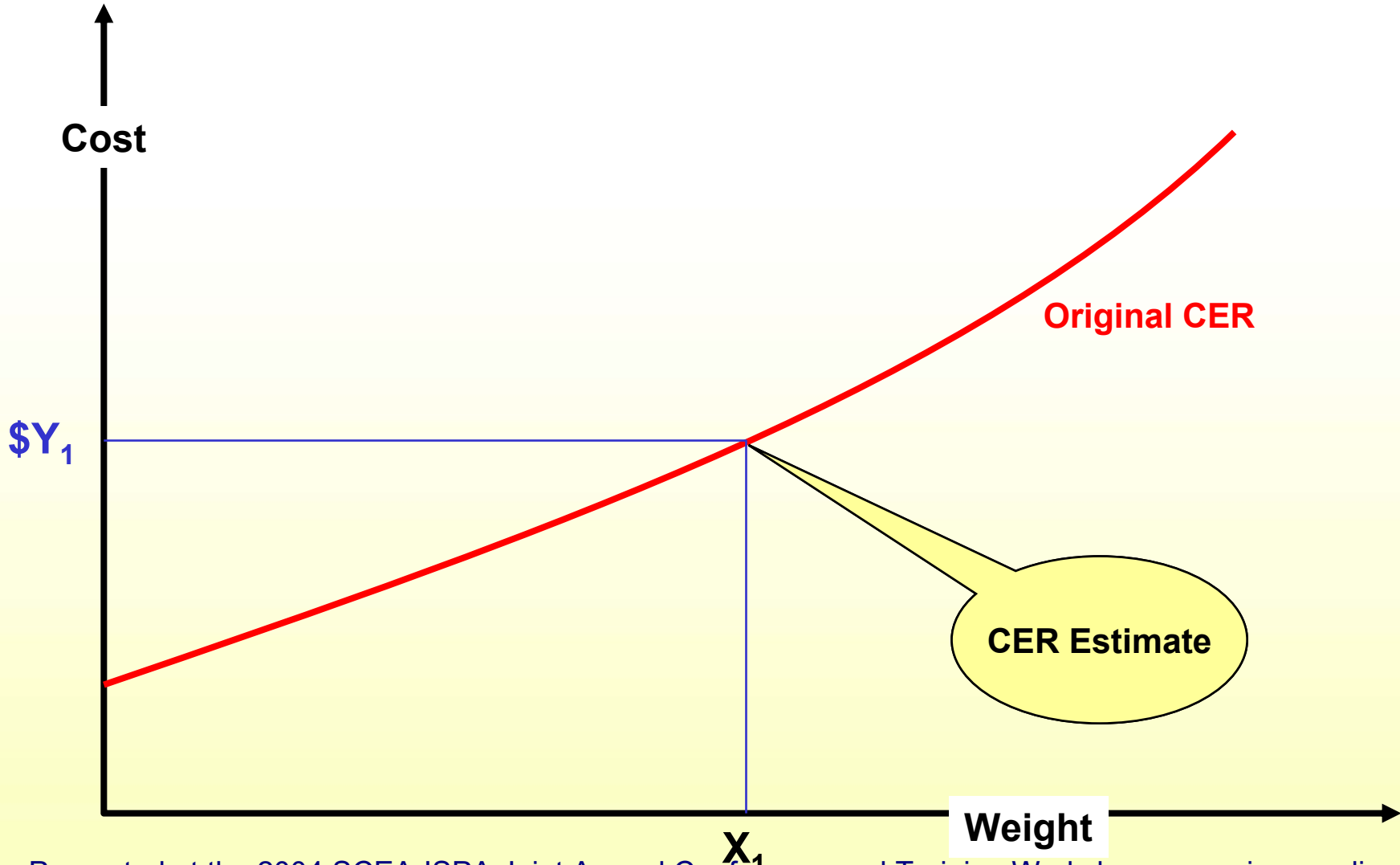
1 *A Framework for Costing in a CAIV Environment*, R. L. Coleman, TASC; D. Mannarelli, Navy ARO, ASNE 1996, ADoDCAS 1996

2 *Relational Correlation, What to do when Functional Correlation is Impossible*, ISPA/SCEA 2001, R.L. Coleman, J.R. Summerville, M.E. Dameron, C.L. Pullen; TASC, Inc., S.S.Gupta, IC CAIG

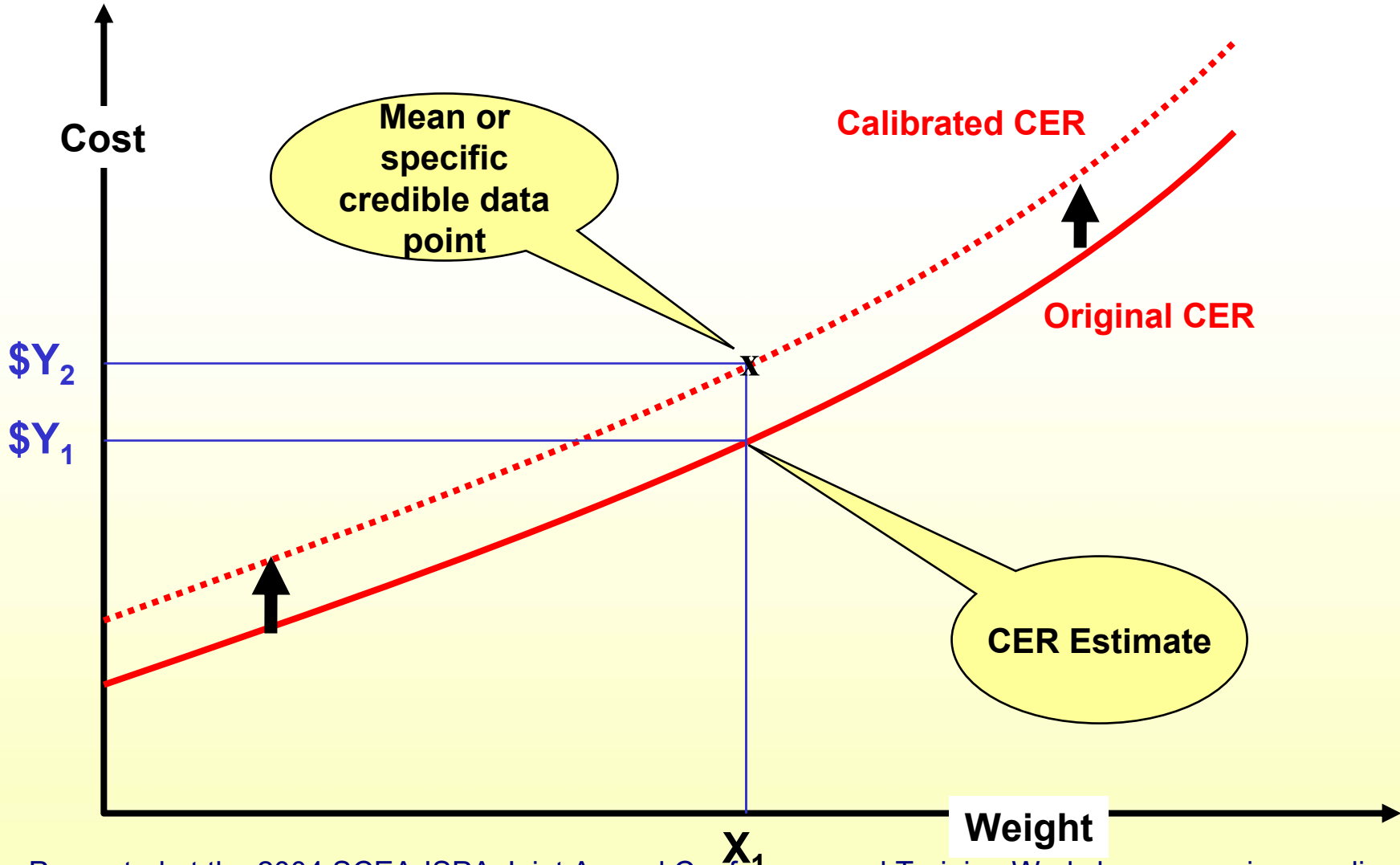
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- **Based on “calibrating a CER”**
 - A CER is adjusted to “more trusted,” or industry, or company specific data by moving the slope to pass through a point or set of points
 - Picture follows
- **To adjust an analogy, do precisely the same thing**
 - Instead of believing you are adjusting a CER to specific data, think of it as departing from “the most credible point” via “the most credible slope”

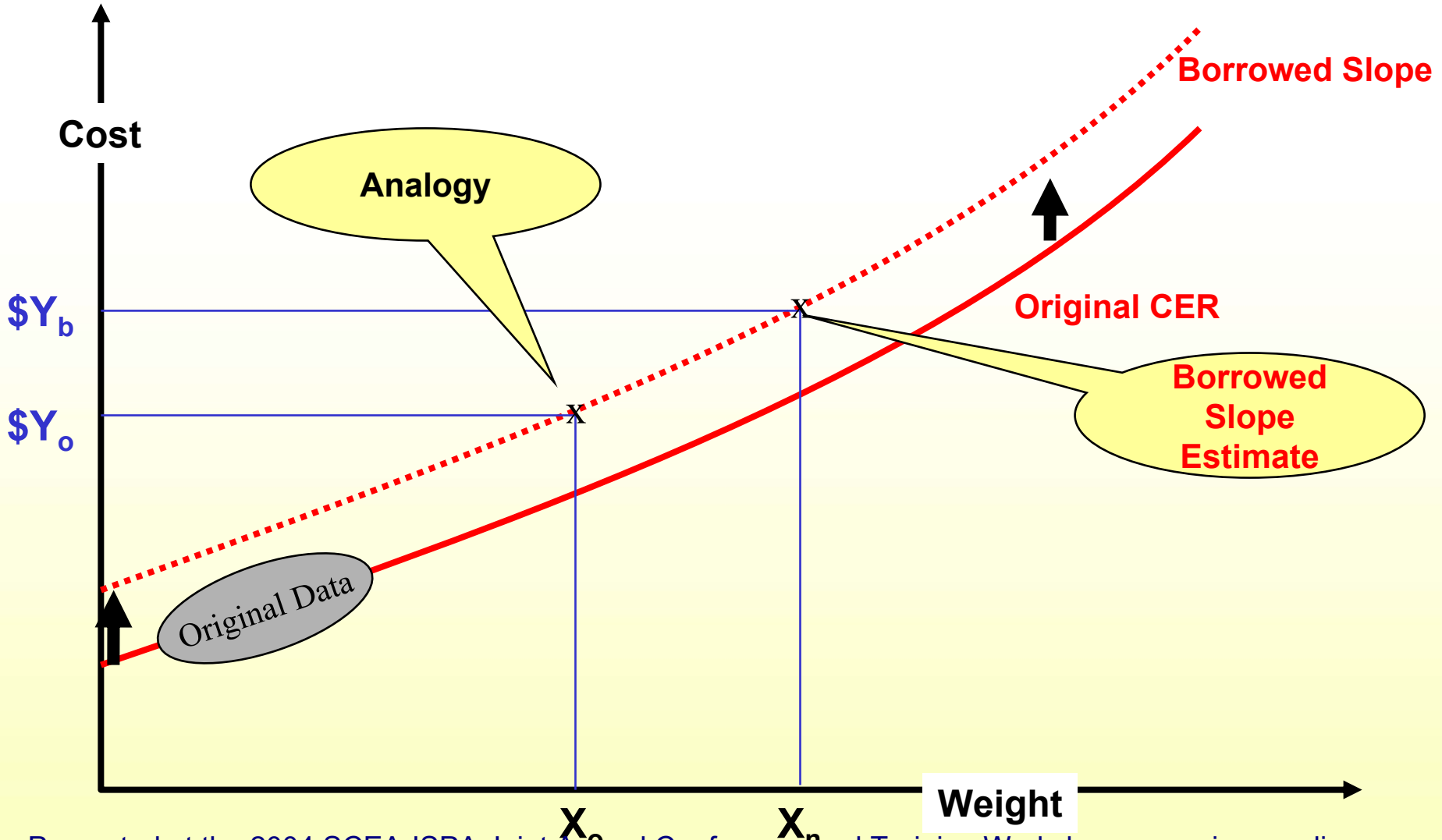
Calibrating CERs



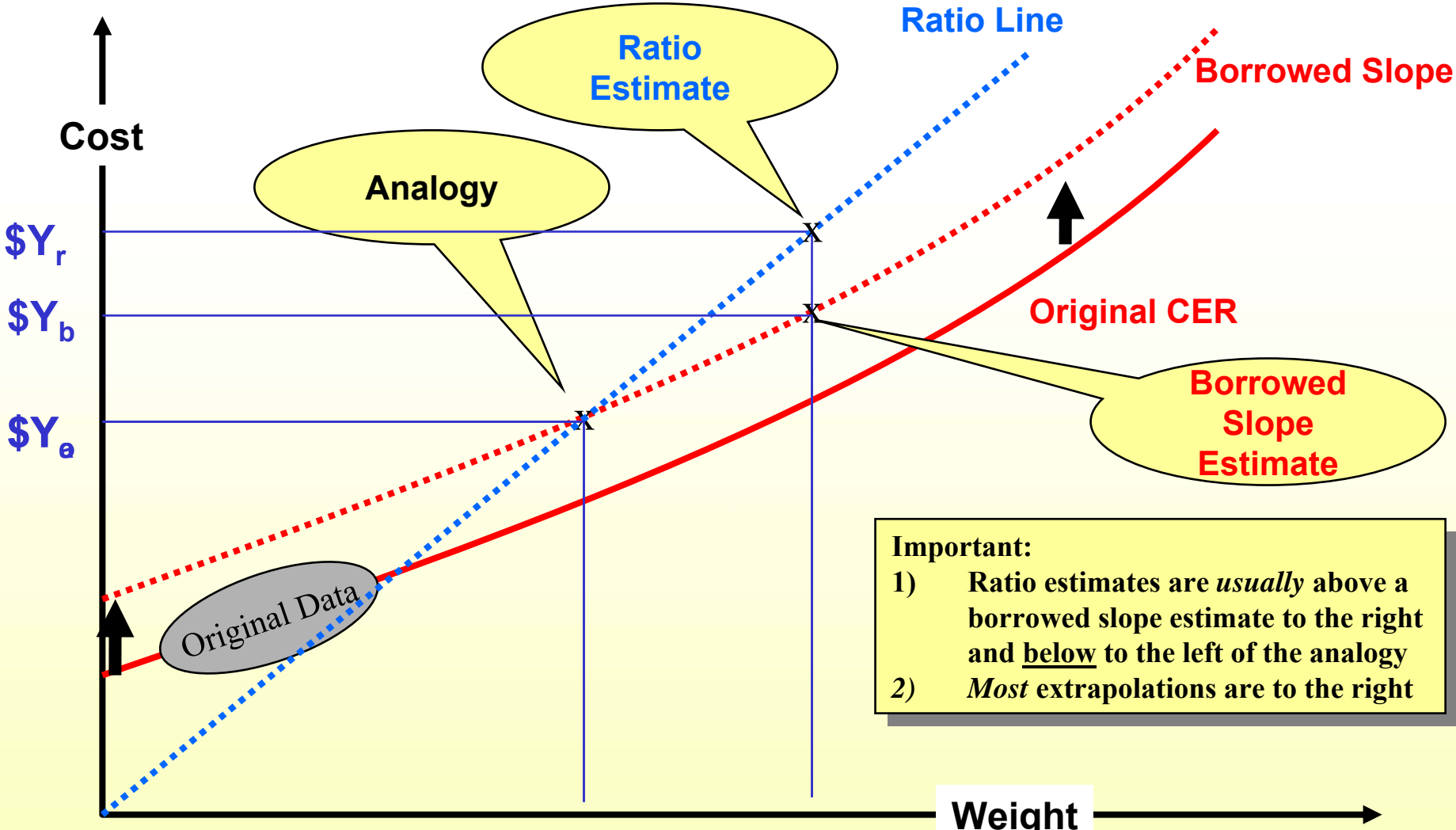
Calibrating CERs



The Borrowed Slope Estimate



Comparison – Borrowed Slope & Ratio Estimates



Important:

- 1) Ratio estimates are *usually* above a borrowed slope estimate to the right and below to the left of the analogy
- 2) *Most* extrapolations are to the right

- **A *much more esoteric* method is available, which borrows from**
 - Bivariate normality
 - The geometry of regression
- **This method is available when there is no “trusted slope” to borrow**

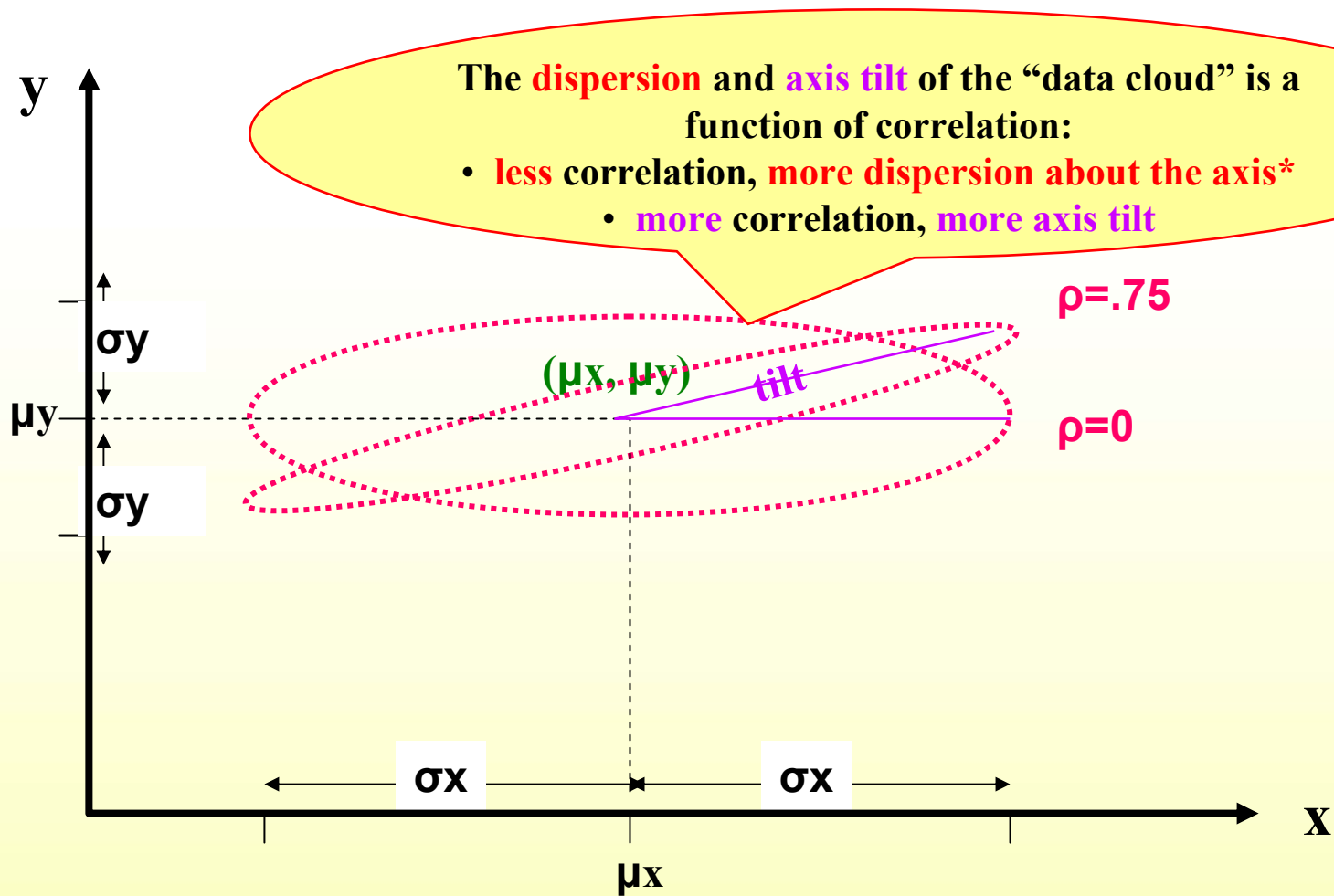


Warning: Serious math follows.

Bivariate Normality

- Suppose X and Y are distributed $N(\mu_x, \sigma_x)$ and $N(\mu_y, \sigma_y)$
- Suppose X and Y are jointly bivariate normal with correlation ρ
.... Then the graph of X and Y will appear as follows

The Bivariate Normal

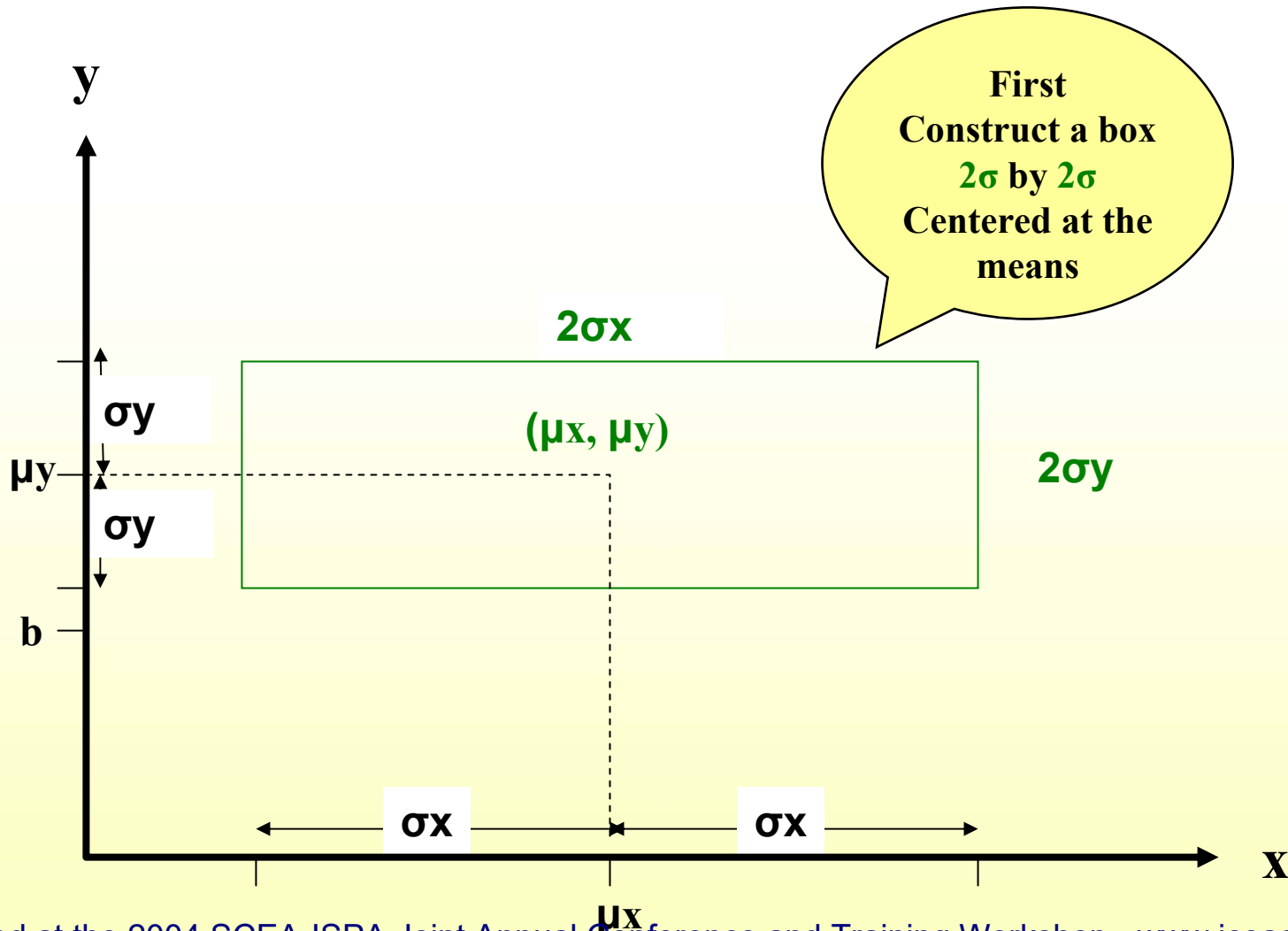


The Geometry of Regression

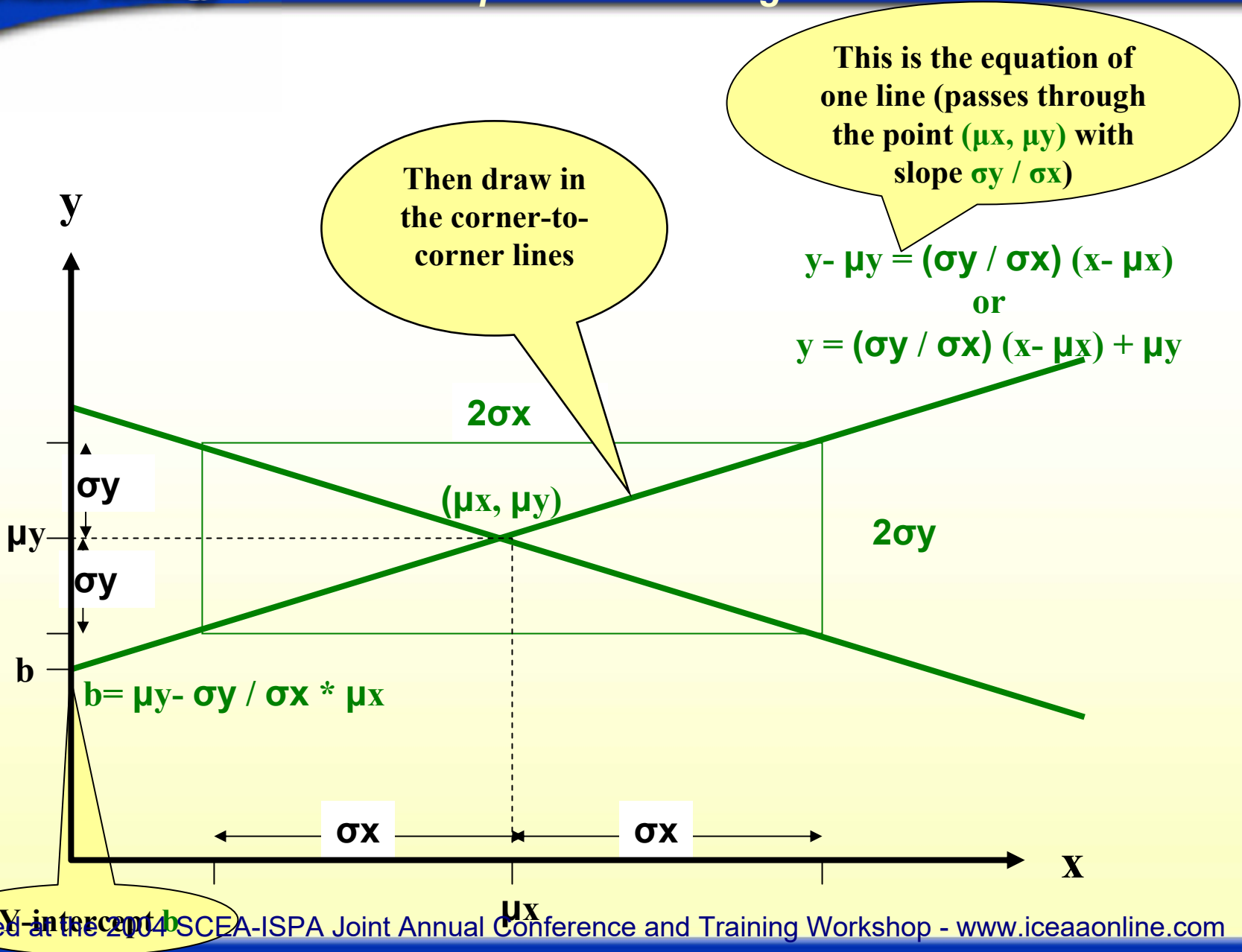
- **The below facts are known to mathematicians, but obscure, and not remembered in cost analysis ...**
 - For any two jointly distributed variables, there is a regression line
 - The slope is:
$$m = \rho * (\sigma_y / \sigma_x)$$
 - The y intercept is:
$$b = \mu_y - \rho (\sigma_y / \sigma_x) * \mu_x$$
 - If the variables are joint bivariate normal, then ρ is the correlation coefficient

Let's look at the graph...

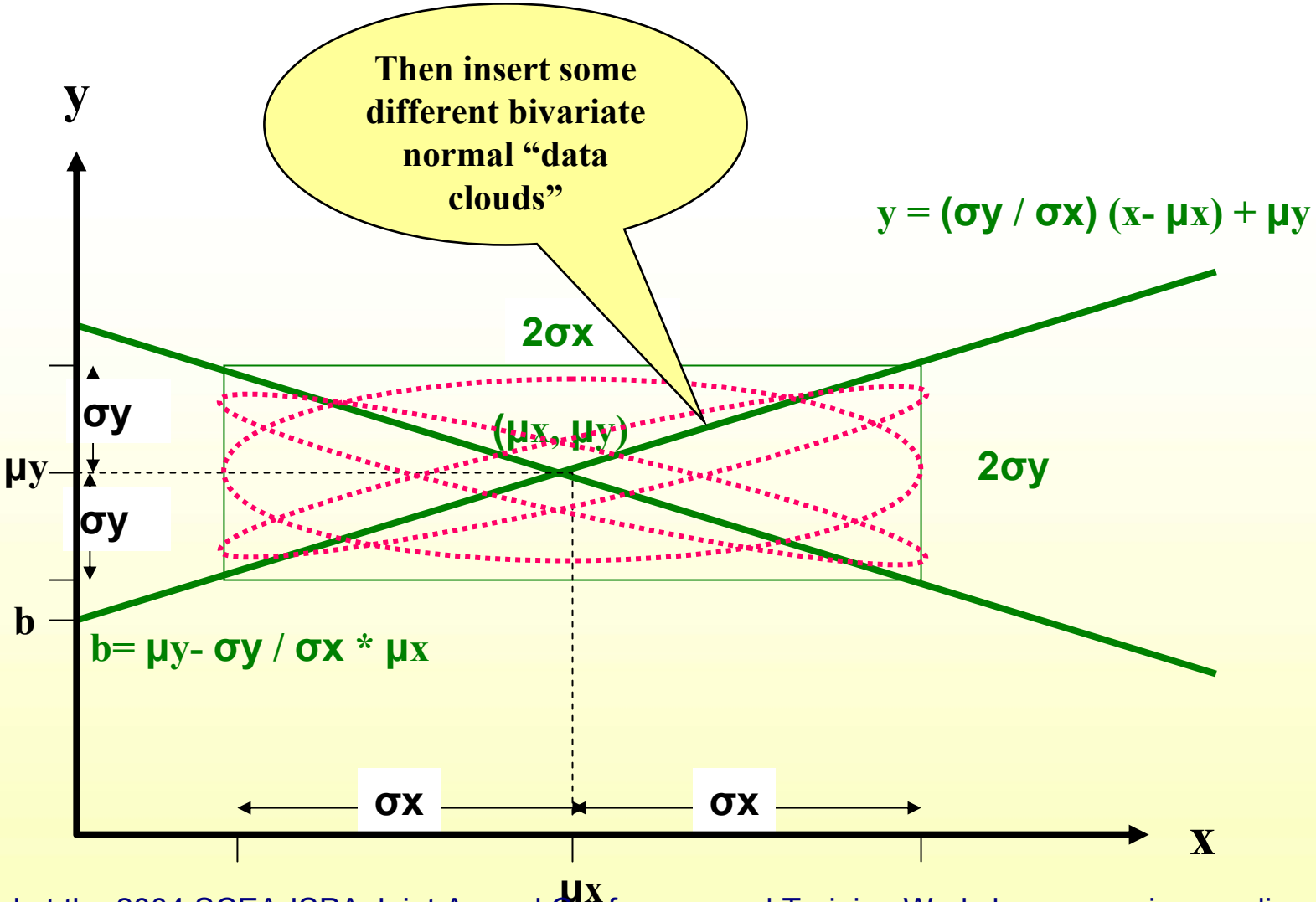
The Geometry of Bivariate Normality and the implications for Regression



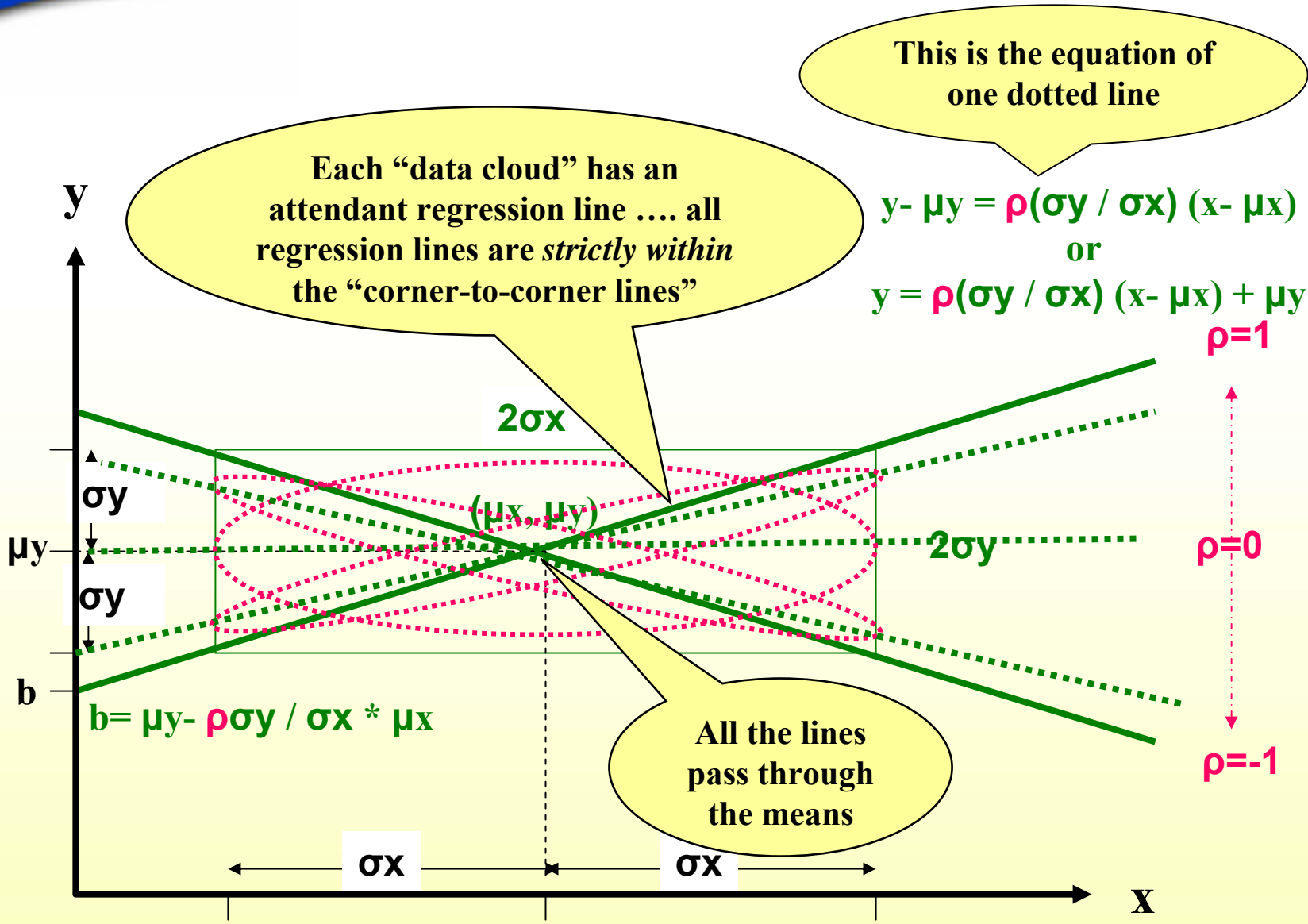
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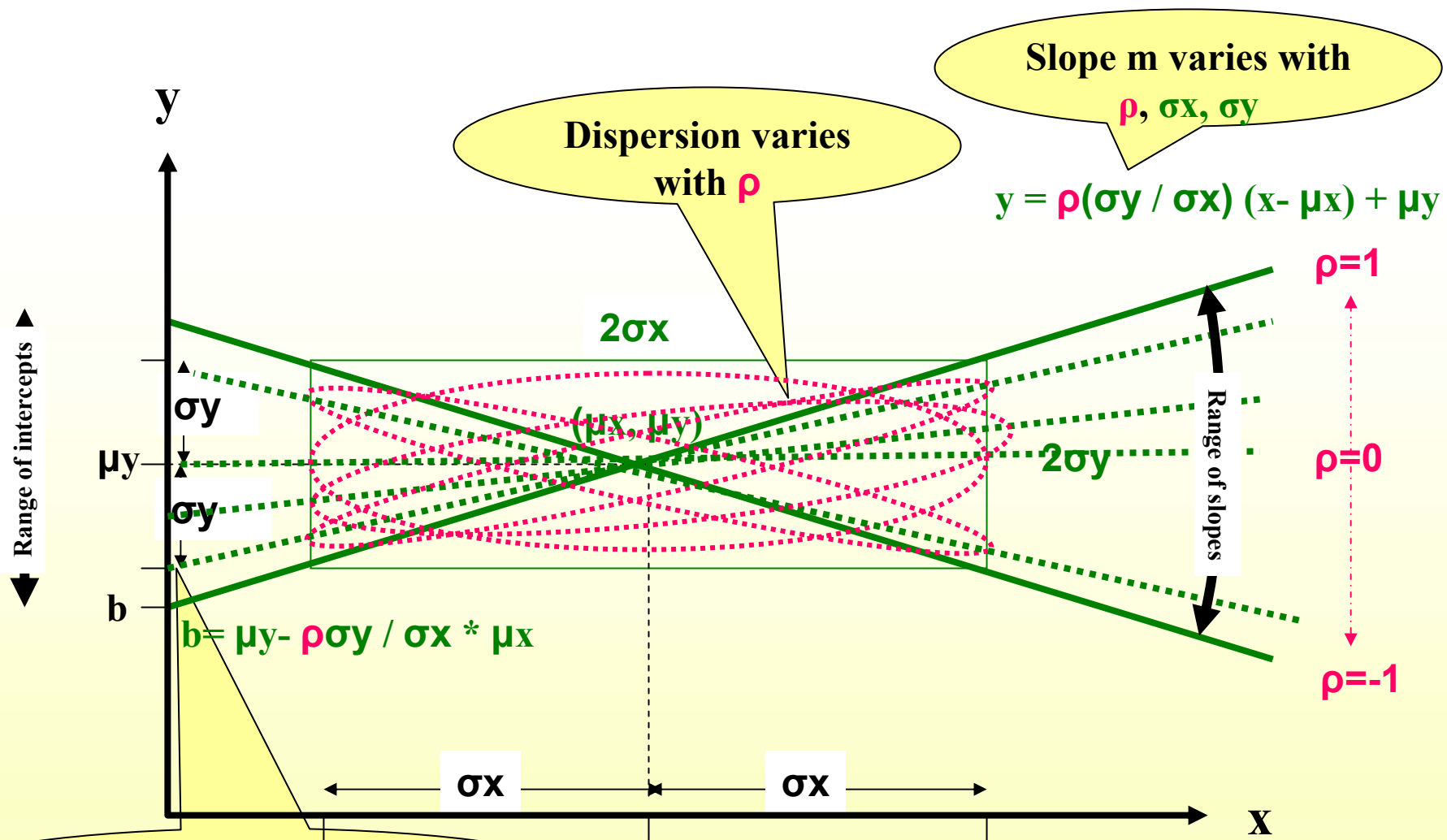
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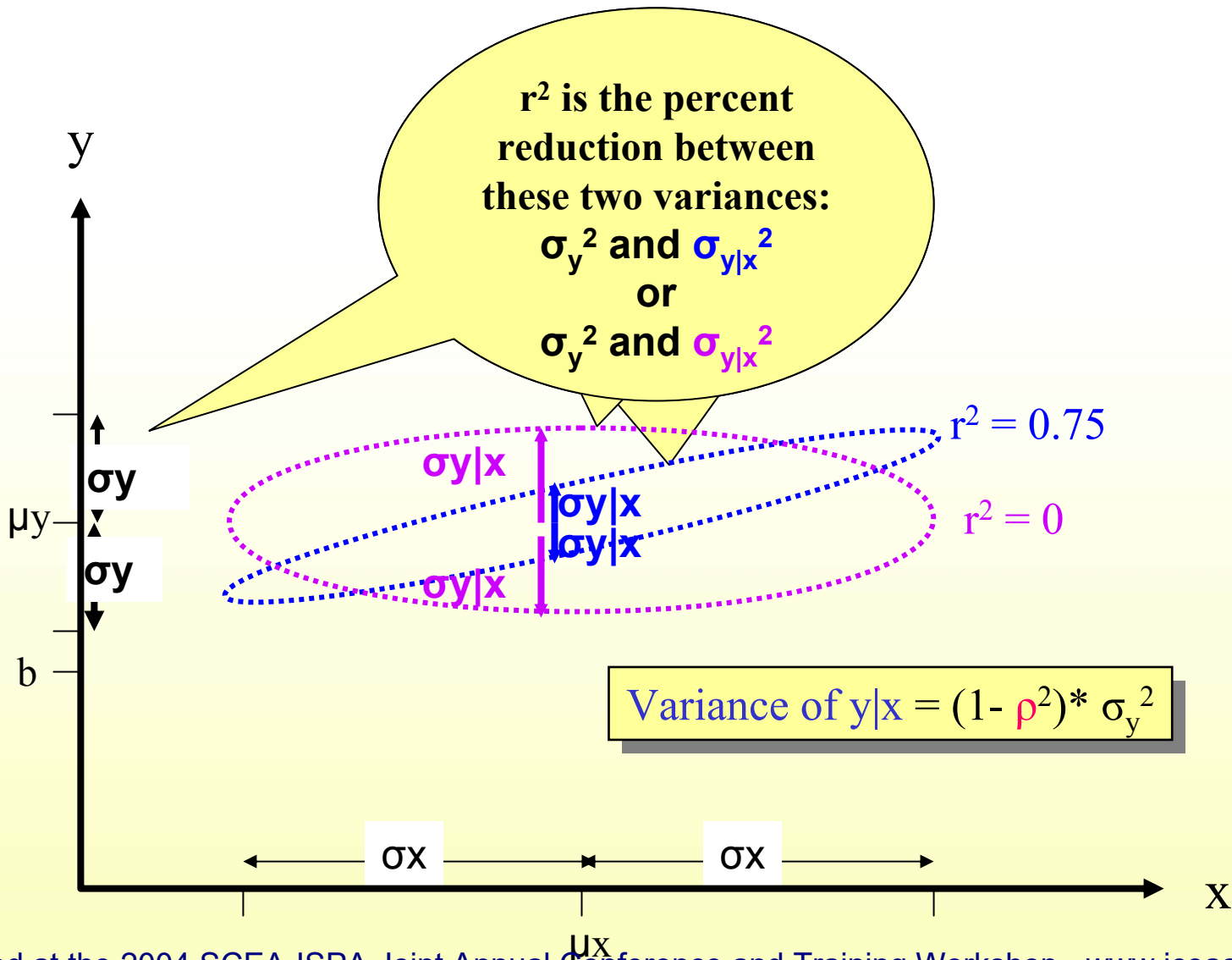
Dispersion varies with ρ

Slope m varies with ρ, σ_x, σ_y

$$y = \rho(\sigma_y / \sigma_x) (x - \mu_x) + \mu_y$$

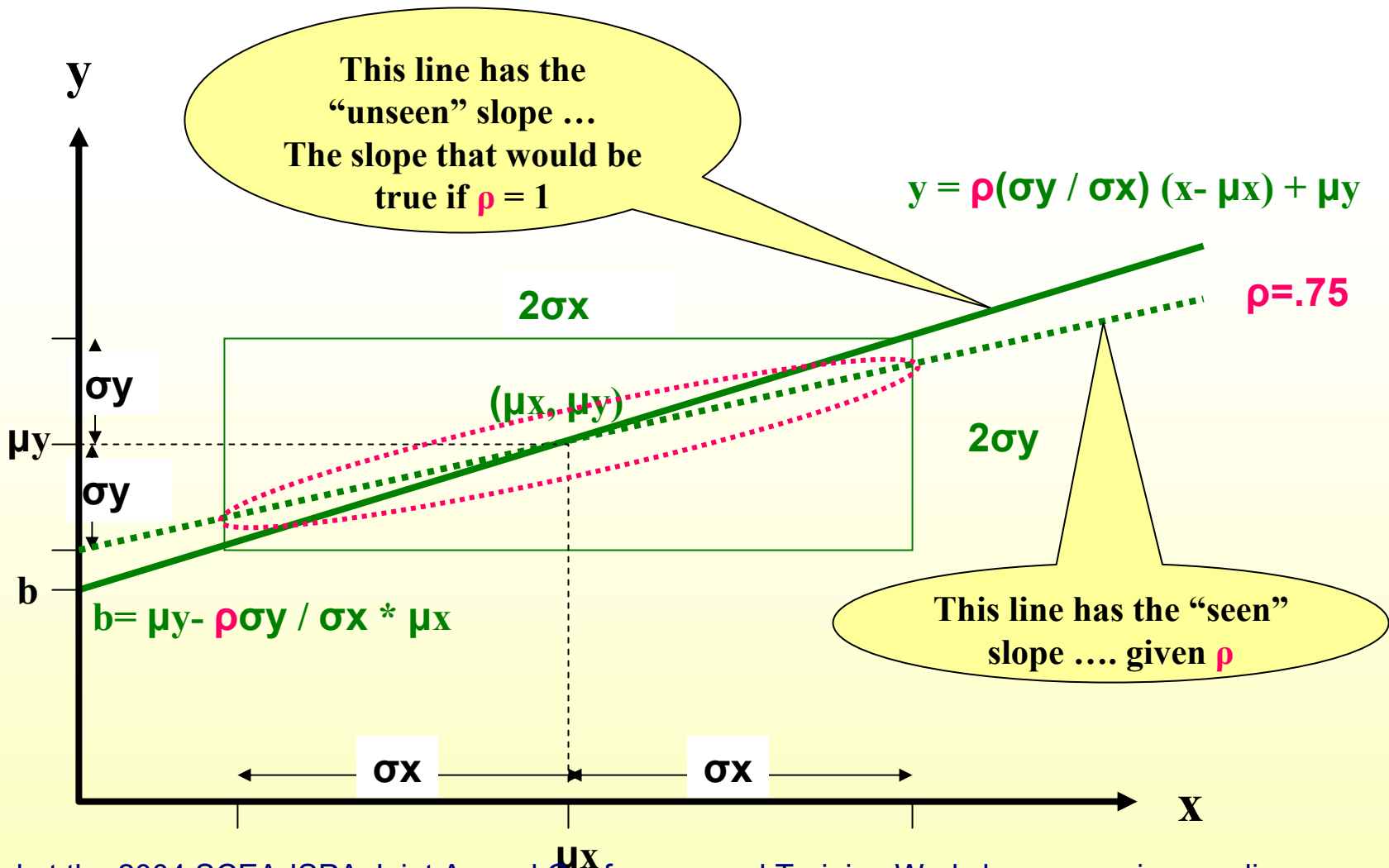
Intercept b varies with $\rho, \mu_x, \text{ and } \mu_y$

The Geometry of Bivariate Normality and the implications for Regression



- **For every regression with apparent slope m , there is an unseen equation**
 - With steeper slope m/ρ which is the *unseen* slope of the two variables
 - With an unseen accompanying y intercept
- **Once we decide upon the means and the variances of x and y , the unseen line is fixed**
 - Once we pick ρ , the regression line is fixed

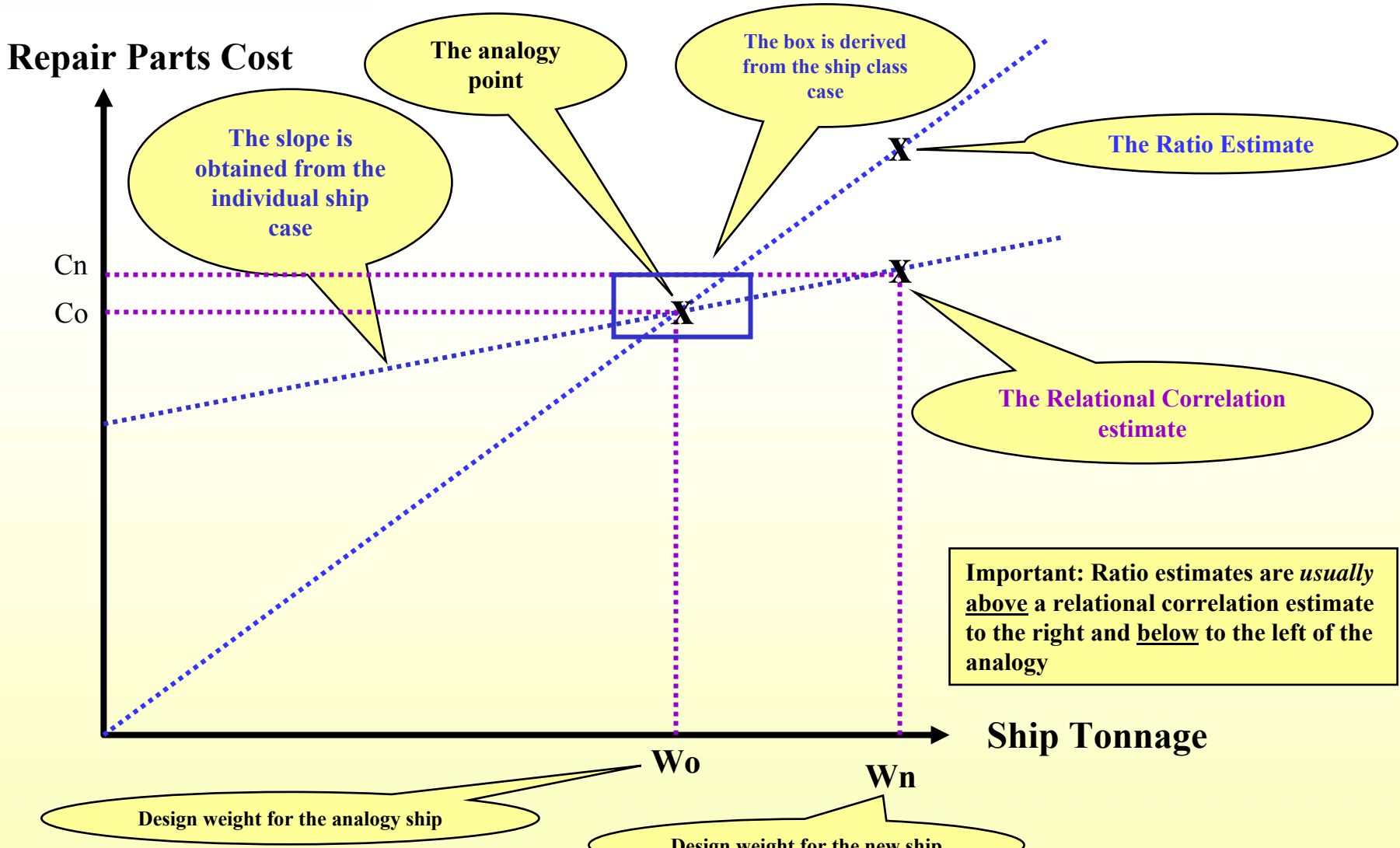
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Implementing Relational Correlation for Analogies

- **For Single Point Analogies**
 - Determine a reasonable (preferably historically-based) standard deviation for the x and y variable
 - E.g, to estimate ship repair parts as a function of tonnage you'll need:
 1. The standard deviation for the analogy ship class repair parts cost
 2. The standard deviation for the tonnage within the ship class
 3. The standard deviation of repair parts for a single ship of the class
 - The ratio of 1 and 2 gives you the unseen slope
 - The relationship of 3 and 1 will yield r^2 (Variance of $y|x = (1 - \rho^2) * \sigma_y^2$)
- **For buildups, do as above, but use an analogy for the values, and apply it to your buildup using percents**

The Relational Correlation Method



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- **Adjustments of analogies have received too little attention**
- **Three methods**
 - Ratio adjustments
 - Current practice
 - Overstate above the analogy, and understate below
 - Borrowed slope
 - Needs a CER
 - Relational correlation
 - Esoteric
 - Does not need a CER
- **Hopefully we have convinced you that ratio adjustment is just not good enough!**

The Problem

- **You have two WBS elements**
 - Warhead cost
 - Motor cost
- **You know their historic means and standard deviations – for both cost and the driving parameter, say weight**
 - You know these values from independent data bases
 - So, you cannot get correlation
- **You *do* have a CER to predict warhead cost**
- **You *do not* have a CER to predict motor cost**
 - You believe weight is a driver, but a CER cannot be derived
 - And, the data you have is too far away from your program, it needs to be adjusted ... but how?
 - You do not wish to simply factor the cost by the weight change
- **This is a typical problem, and is closely related to the risk problem just described**
- **We will try to predict motor cost as a function of warhead cost ... a useful equation as well as a helpful CER**

1. Ask the engineer: *How much leeway in % do you typically have for weight (or cost) of the motor if design has not yet begun? (The unconstrained case)*
 - Note: this may differ from the historic variation, but we will use it only in a relative sense
 - We will translate the weight fluctuation into cost fluctuation
2. Ask the engineer: *How much leeway in % do you have for weight (or cost) of the motor, if design of the warhead is complete? (The constrained case)*
3. This will give you r^2 :
 - You already knew the “unseen slope”, σ_y/σ_x , now you know the “seen” slope $\rho(\sigma_y / \sigma_x)$, and you know $b = \mu_y - \rho\sigma_y/\sigma_x * \mu_x$
 - The percent reduction in the variance of y is the r^2 , and the square root of that is r (Variance of $y|x = (1 - \rho^2) * \sigma_y^2$)
4. Implement the result as a CER, by passing the slope through the analogy or average of your data.

Note: We do not advocate using such a CER in lieu of a standard CER, only if there is no other recourse

How to Implement Relational Correlation for Expert-Based CERs

Motor cost

