## I Was Told There Would Be No Math: What Every Employment Lawyer Should Know About Statistical Proof In Employment Matters

Susan E. Dunnings Vice President, Associate General Counsel Lockheed Martin Corporation

LOCKHEED MARTIN

Kris D. Meade Partner Crowell & Moring LLP crowell Greg Watchman - Moderator Associate General Counsel Freddie Mac



Paul F. White, PhD Managing Director ERS Group



#### Agenda

- Statistical Analyses in Employment Matters
  - Litigation Class Action/Systemic Discrimination
  - Non-Litigation RIFs, OFCCP Audits
- Compensation
  - Comparison of Averages
  - Regression Analyses
- Employee Selections
  - Comparison of Selection Rates
  - Regression Analyses
- Statistically-Significant Results. What Next?
  - Litigation Context
  - Non-Litigation Context
- Wage & Hour Issues
- Best Practices









#### Appropriate Uses of Statistical Analysis

- Litigation Context
  - Class certification stage commonality
  - Merits stage
  - Impact of *Wal-Mart v. Dukes* one year later
- Class Action Readiness Context Non-Litigation
  - Pro-active assessments of vulnerabilities
    - RIFs
    - Real-time assessments of other employment decisions
  - Key prepare to act on adverse findings
- OFCCP Audit Context
  - Implications of proposed revised scheduling letter









#### Privilege Issues

- Litigation Context
- Non-Litigation Context
  - Analyses must be done at the direction of counsel for the purpose of providing legal advice
    - Not a routinized HR or business matter
    - Formalistic approach
  - HR and business leaders acting on legal advice, rather than Legal acting as decision-makers
  - Must tightly control communications cannot share results broadly
    - Face-to-face meetings rather than email
    - Implications for process HR and management challenge
    - Legal collects all documentation at end of process









#### Key Considerations

- Similarly-Situated Employees
  - Statistical analysis needs to compare employees who are similarly-situated
  - At what level are decisions made?
  - What factors were considered?
- Data Integrity
  - Availability of data to model the reality of the decisionmaking process
  - Data strengths and weaknesses
  - Likely affect on outcomes



















#### Statistical Methods of Analyzing Compensation

• Difference Between Averages

• Multiple Regression Analysis









#### Comparison of Averages

- Calculate the average salary of one grouping of employees.
  - Average Salary of Male Employees = \$77,648
- Calculate the average salary of second grouping of employees.
  - Average Salary of Female Employees = \$61,996
- Compute the difference between the average salary of the two groupings of employees.

- Difference = -\$15,652

• Is the difference statistically significant?



















#### Limitations of Average Salary Comparisons

- They do not control for other factors that are used to determine compensation levels
- Can be heavily influenced by unusual observations









#### Potential Determinants of Employee Pay

- Pay Grade / Pay Plan
- Job Title
- Years of company-specific experience
- Education
- Market pay rates
- Prior relevant experience
- Other (varies by employer)









#### **Regression Analysis**

- Statistical method used to measure the relationship between variables.
  - Are they positively or negatively related?
  - How strongly are they related?
  - Are they significantly related?
  - Regression analysis accounts for differences between groupings of employees with respect to factors that affect compensation
    - Then estimates average pay differential









Hypothetical Example - For Illustrative Purposes Only Relationship Between Actual Salary and Market Salary



#### Estimated Simple Regression Line Relationship Between Actual Salary and Market Salary



Estimated Simple Regression Line Relationship Between Actual Salary and Market Salary



Hypothetical Example - For Illustrative Purposes Only



#### "Influential Observations"

- A few employees may contribute substantially more than others to the protected/unprotected salary gap.
  - These employees are called *outliers*.
  - Employees who unduly influence the equation can be identified by using more advanced regression techniques.









## Potential Explanations for Influential Employees

- The salaries of employees with the greatest influence can be investigated. Is it:
  - Measurement error?
  - Unusual compensation plans?
  - Unusual or atypical jobs?
  - Something else?
- If there are data problems they should be corrected.
- If there are individuals who have highly unusual compensation plans, then the model may not be appropriate for these employees.



![](_page_17_Picture_9.jpeg)

![](_page_17_Picture_10.jpeg)

![](_page_17_Picture_11.jpeg)

#### Multiple Regression Analysis

#### Company ABC

, Model	Female/Male Salary Difference (Female Coefficient)	Number of Standard Dev. (t)
1. Female	-\$15,652	-11.23
2. Model 1 plus Pay Grade	-\$10,956	-6.05
3. Model 2 plus Years of Experience Variable	-\$ 2,385	-2.89
4. Model 3 plus Highest Level of Education Indicators	-\$ 1,812	-2.31
5. Model 4 plus Admin Indicato	or -\$ 749	-1.42

![](_page_18_Picture_4.jpeg)

![](_page_18_Picture_5.jpeg)

![](_page_18_Picture_6.jpeg)

![](_page_18_Picture_7.jpeg)

#### Common Causes of Pay Disparities

- Pay decisions made in the past
  - Starting pay, merit increases, promotional increases, pay adjustments
- Performance evaluations vs. raises
- Job titles vs. actual responsibilities
- Comparisons of non-similarly-situated employees
- Natural attrition
- Mergers and acquisitions

![](_page_19_Picture_8.jpeg)

![](_page_19_Picture_9.jpeg)

![](_page_19_Picture_10.jpeg)

![](_page_19_Picture_11.jpeg)

## **Employment Selections**

![](_page_20_Picture_1.jpeg)

![](_page_20_Picture_2.jpeg)

![](_page_20_Picture_3.jpeg)

![](_page_20_Picture_4.jpeg)

### Fisher's Exact Test

- Comparison of selection rates
  Comparison group's status vs. selection status
- Selection rate of group vs. availability of group
- Small and large sample sizes

![](_page_21_Picture_4.jpeg)

![](_page_21_Picture_5.jpeg)

![](_page_21_Picture_6.jpeg)

![](_page_21_Picture_7.jpeg)

#### Fisher's Exact Test

	Layoff	Retain	Total
40 Plus	40	20	60
LT 40	60	62	122
Total	100	82	182

#### Statistically Significant at 2.22 Standard Deviations

![](_page_22_Picture_3.jpeg)

![](_page_22_Picture_4.jpeg)

![](_page_22_Picture_5.jpeg)

![](_page_22_Picture_6.jpeg)

#### **Regression Analysis**

- Selection decisions usually based on multiple factors
  - Experience
  - Qualifications
  - Market factors
  - Organizational unit
  - Occupation/Job title
  - Other
- Logistic Regression
  - Does the protected group have a significantly greater/lesser probability of being selected <u>after</u> accounting for other factors that affect the selection decision?

![](_page_23_Picture_10.jpeg)

![](_page_23_Picture_11.jpeg)

![](_page_23_Picture_12.jpeg)

![](_page_23_Picture_13.jpeg)

#### Logistic Regression is Used When the Dependent Variable is Zero or 1

- Selected (1) or Not (0)
- Hired (1) or Not (0)
- Terminated (1) or Not (0)
- Promoted (1) or Not (0)
- Yes/No (It happened (1) or it did not (0))

We want to determine the probability of selection. How likely is it that someone will be selected?

![](_page_24_Picture_7.jpeg)

![](_page_24_Picture_8.jpeg)

![](_page_24_Picture_9.jpeg)

![](_page_24_Picture_10.jpeg)

*Hypothetical Example - For Illustrative Purposes Only* 

#### Logistic Regression Analysis of Layoffs Score Sheet Data 40+ vs. LT 40

Logit estimate	es			Numbe	r of obs	=	182
				LR ch	i2(9)	=	83.36
				Prob	> chi2	=	0.0000
Log likelihood	d = -55.417889	9		Pseud	o R2	=	0.4293
Promo	Odds Ratio	Std. Err.	Z	P> z	[95%	Conf.	Interval]
40 plus	1.053792	1.142523	1.00	0.317	.5539	251	6.203987
eval_pts	1.284233	.0611108	5.26	0.000	1.169	874	1.409771
tig_pts	1.91386	.4146098	3.00	0.003	1.251	727	2.926244
ed_pts	1.298449	.0743026	4.56	0.000	1.160	688	1.45256
train_pts	1.269783	.0871221	3.48	0.000	1.11	001	1.452553
Grade F	.0023249	.0029475	-4.78	0.000	.0001	937	.0278975
Grade G	.0004915	.000816	-4.59	0.000	.000	019	.0127251
DC	1.937040	17.32524	3.21	0.001	3.151	807	113.7797
LA	.0816028	.0842755	-2.43	0.015	.0107	802	.6177112

![](_page_25_Picture_3.jpeg)

LOCKBEED MA

![](_page_25_Picture_5.jpeg)

![](_page_25_Picture_6.jpeg)

# Statistically Significant Results in Litigation or Audit Context: Then What?

- Does the model accurately reflect decision-making process?
- Data correct?
- Outliers?
- Correct statistical methods?
- Correct computer programs?
- Identify the source of disparity focus on segment of workforce to limit liability & damages

![](_page_26_Picture_7.jpeg)

![](_page_26_Picture_8.jpeg)

![](_page_26_Picture_9.jpeg)

![](_page_26_Picture_10.jpeg)

#### Statistically Significant Results in Non-Litigation Context: Then What?

- Same considerations, plus others driven by context
- Review/revisit decisions and criteria
  - "Validation" of results
  - Revise selection or reward decisions, make pay adjustments
- Identify process improvement opportunities
  - Targeted training focus on sources of disparities
  - Narrow range of discretion, revise selection criteria
- Identify the source of disparity focus on segment of workforce to limit liability & damages

![](_page_27_Picture_9.jpeg)

![](_page_27_Picture_10.jpeg)

![](_page_27_Picture_11.jpeg)

![](_page_27_Picture_12.jpeg)

![](_page_28_Picture_0.jpeg)

#### Allegations of Wage & Hour Violations

- Plaintiff/Agency Approaches
  - -Misclassification, Off-the-clock
    - -Both depend on measures of work time
  - -Reliance on claims of named plaintiffs or claimants as being representative
  - Take advantage of shortcomings in employers' data

#### Commonality – Class Cert

Overtime Pay as a Percent of Total Pay - Opt-Ins 2009

![](_page_30_Figure_2.jpeg)

Overtime Pay as a Percent of Total Pay (Regular Plus Overtime Pay)

#### Example: Meal Break Violation?

Date	Time of Swipe	Туре	Edited
10/26	11:00AM	In	No
10/26	4:30PM	Out	No

11:00AM

4:30PM

- A typical timekeeping system will interpret this sequence of swipes as 5.5 hours of work.
- The same sequence of swipes may be used to support an allegation that there was a meal period violation because there is no record of a meal period taken during the shift.

![](_page_32_Figure_0.jpeg)

- To leave early, the employee took a meal period at the end of the shift.
- The employee did not want to take a break that day (waiver).
- The employee took the break yet forgot to swipe for it.

#### Example: Off-the-Clock Work?

![](_page_33_Figure_1.jpeg)

34

## Allegations of Wage & Hour Violations

- Suggestions for employers
  - -Understand and document employee classification decisions
  - -Review quality of data and policies
  - Proactive confidential analyses
    - Off-the-clock
    - Meal and Rest break violations
    - Correct calculation of overtime rate
    - Minimum wage violations
    - Time-shaving
    - If problems, company-wide or isolated to rogue manager?

#### **Best Practices**

- Data maintenance
- Know where you stand
  - Regular assessments, directed by counsel
  - Focus on compensation, selection decisions, and wage and hour
- Comparisons of similarly-situated employees
   Job titles vs. actual responsibilities
- Validate performance evaluation process key selection decision and variable in other regression models
- Justify starting salary levels capture justifications
- Be prepared to act upon adverse findings

![](_page_35_Picture_9.jpeg)

![](_page_35_Picture_10.jpeg)

![](_page_35_Picture_11.jpeg)

![](_page_35_Picture_12.jpeg)

## I Was Told There Would Be No Math: What Every Employment Lawyer Should Know About Statistical Proof In Employment Matters

Susan E. Dunnings Vice President, Associate General Counsel Lockheed Martin Corporation

LOCKHEED MARTIN

Kris D. Meade Partner Crowell & Moring LLP crowell moring Greg Watchman - Moderator Associate General Counsel Freddie Mac

![](_page_36_Picture_5.jpeg)

Paul F. White, PhD Managing Director ERS Group

![](_page_36_Picture_7.jpeg)