# Santa-Clara University

# Predicting Patent Litigation

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## 250K Patents



### 250K Patents

### Held by:

- IBM
- Nortel
- Google
- Apple
- Others

### 250K patents...

"Most of its junk"



"there's a lot of crap out there"

"Need to kiss a lot of frogs"



the good ones?

Which are

250K Patents



250K Patents Defensively: Which patents are the riskiest ones?

### Problem: Which Patents will be litigated?

#### <u>Issuance</u>

#### (12) United States Patent

(54) TOUCH PAD HANDHELD DEVICE

(73) Assignee: Apple Computer, Inc., Cupertino, CA

patent is extended or adjusted under 35 U.S.C. 154(b) by 117 days.

(21) Appl. No.: 10/188,182

(22) Filed: Jul. 1, 2002

Prior Publication Data US 2003/0076306 A1 Apr. 24, 2003

Related U.S. Application Data

(60) Provisional application No. 60/359,551, filed on Feb. 25, 2002, provisional application No. 60/346,237, filed on Oct. 22, 2001.

#### **Enforcement**

Litigate

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### **Relevant Traits**

#### <u>Issuance</u>

#### (12) United States Patent

(54) TOUCH PAD HANDHELD DEVICE

(75) Inventors: Stephen Paul Zadesky, San Carlos, CA (US); Tang Yew Tan, San Francisco, CA (US)

(73) Assignce: Apple Computer, Inc., Cupertino, CA
(US)

patent is extended or adjusted under 35 U.S.C. 154(b) by 117 days.

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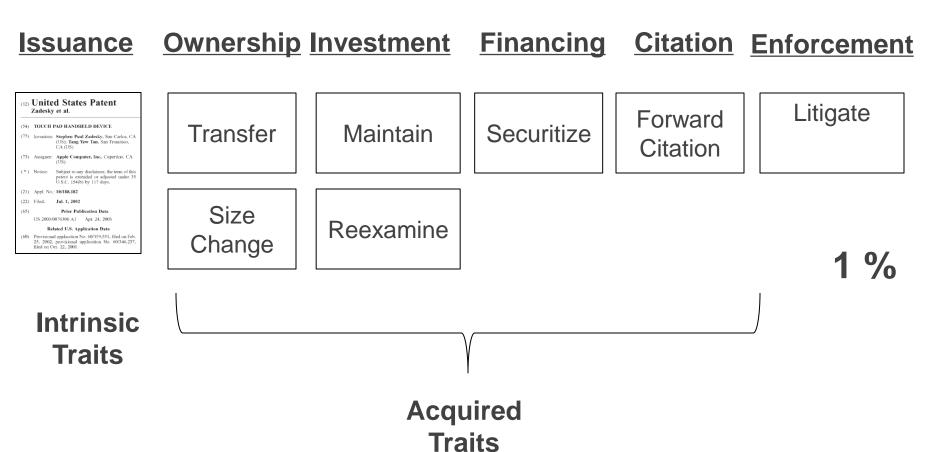
#### **Enforcement**

Litigate

1 %

#### **Intrinsic Traits**

#### **Patent Events**



#### Methods

#### **Data**

- Matched pair set: 667 litigated patents and 3 x 667 unlitigated patents issued in 1990 and matched by primary PTO technology class (rare events model)
- Log-transformed versions of continuous variables

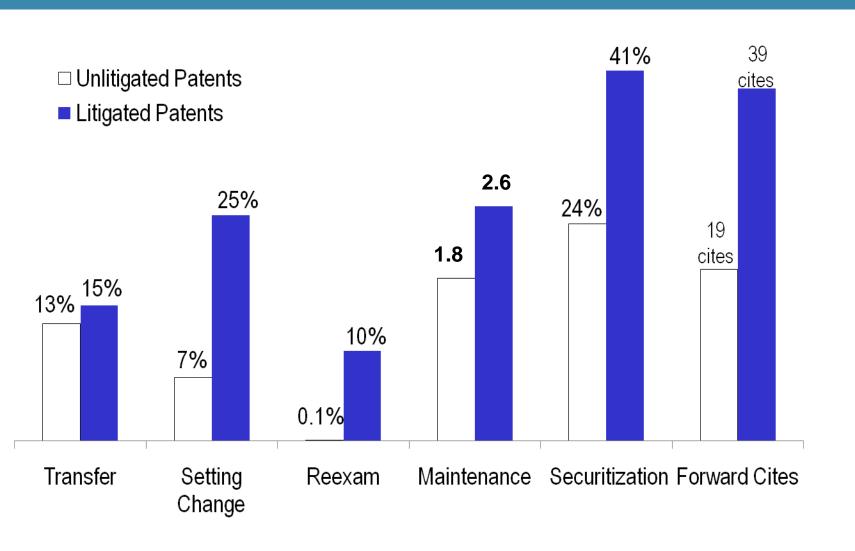
#### **Coding**

- Transfer: hand-coded to find true re-assignments and exclude M&A, intra-company transfers
- Reexamination: ex parte only

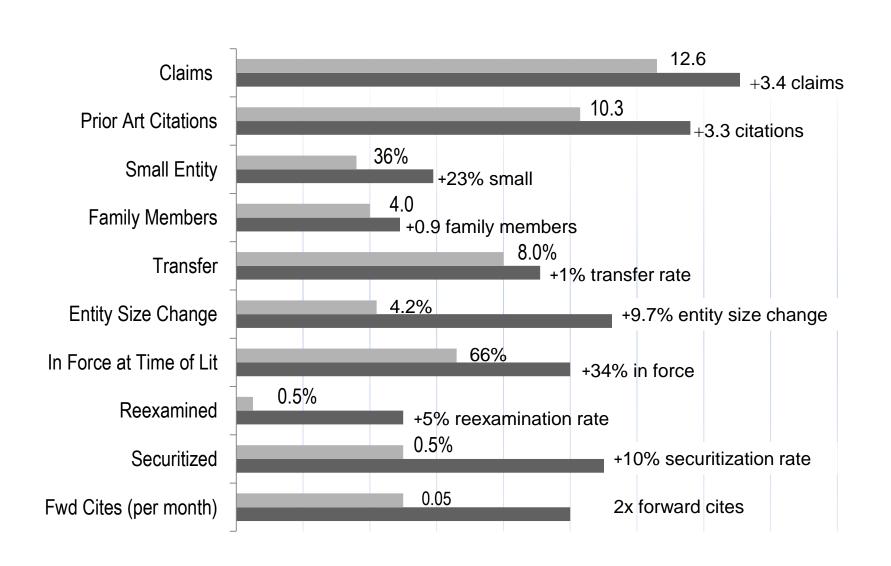
#### **Statistics**

- Logistic regression (SPSS)
- Characteristics developed over life and prior to first litigation (time-series)
- Intrinsic, acquired, and intrinsic + acquired

# Litigated vs. Unlitigated Patents – Acquired Traits (Characteristics Developed Over Patent Lifetime)



# Litigated vs. Unlitigated Patents (Characteristics Developed Prior to Litigation)



# Logistic Regression Model Results (Time-Series)

|                       | Lifetime Model                              |           |               | Time-Series Model                            |           |               |
|-----------------------|---|-----------|---------------|--|-----------|---------------|
|                       | (Characteristics Acquired over Patent Life) |           |               | (Characteristics Acquired Prior to Filing of |           |               |
|                       |   |           |               | First Litigation)                            |           |               |
| Variables in the      | Intrinsic                                   | Acquired  | Intrinsic and | Intrinsic                                    | Acquired  | Intrinsic and |
| Equation              | Variables                                   | Variables | Acquired      | Variables                                    | Variables | Acquired      |
|                       | Only  | Only      | Variables     |  |           | Variables     |
| Nagelkerke R          | .106  | .334      | .380          | .104   | .372      | .418          |
| Square                |   |           |               |  |           |               |
| Intrinsic Variables   |   |           |               |  |           |               |
| Claims (Log)          | 1.475***                                    | -         | 1.217**       | 1.467)***                                    | -         | 1.345***      |
|                       | (.059)                                      |           | (.068)        | (.060  |           | (.068)        |
| Prior Art Cites (Log) | 1.126*                                      | -         | .946          | 1.124  | -         | .983          |
| . 0,                  | (.061)                                      |           | (.069)        | (.061)                                       |           | (.069)        |
| Small/Ind InitialŦ    | 3.156***                                    | -         | 3.259***      | 3.142)***                                    | -         | 3.013***      |
| Owner                 | (.102)                                      |           | (.121)        | (.103)                                       |           | (.118)        |
| Family Members        | 1.327***                                    | -         | 1.129*        | 1.332***                                     | -         | 1.208***      |
| (Log)                 | (.055)                                      |           | (.063)        | (.055)                                       |           | (.062)        |
| Acquired Variables    | -   |           |               | -  |           |               |
| Assignments           | -   | .279***   | .339***       | -  | .208***   | .251***       |
| (Log)                 |   | (.140)    | (.145)        |  | (.140)    | (.146)        |
| TransferŦ             | -   | 2.061***  | 1.802**       | -  | 2.311***  | 2.067***      |
|                       |   | (.196)    | (.204)        |  | (.224)    | (.235)        |
| Size ChangeT          | -   | 2.833***  | 2.055***      | -  | 2.446***  | 1.990***      |
|                       |   | (.144)    | (.155)        |  | (.192)    | (.200)        |
| ReexamŦ               | -   | 80.822*** | 79.408***     | -  | 65.893*** | 63.085***     |
|                       |   | (.747)    | (.764)        |  | (1.039)   | (1.049)       |
| Maintenance           | -   | 1.949***  | 2.173***      | -  | 6.6E+08   | 7.E+08        |
| FeesŦ                 |   | (.059)    | (.063)        |  | (1507.8)  | (1474.4)      |
| Fwd Cites (Log)       | -   | 1.513***  | 1.486***      | -  | 61.391*** | 60.574***     |
|                       |   | (.047)    | (.050)        |  | (.636)    | (.670)        |
| SecuritizedŦ          | -   | 1.694**   | 1.492*        | -  | 2.667***  | 2.458***      |
|                       |   | (.170)    | (.175)        |  | (.188)    | (.192)        |

\*\*s convey significance of Difference.

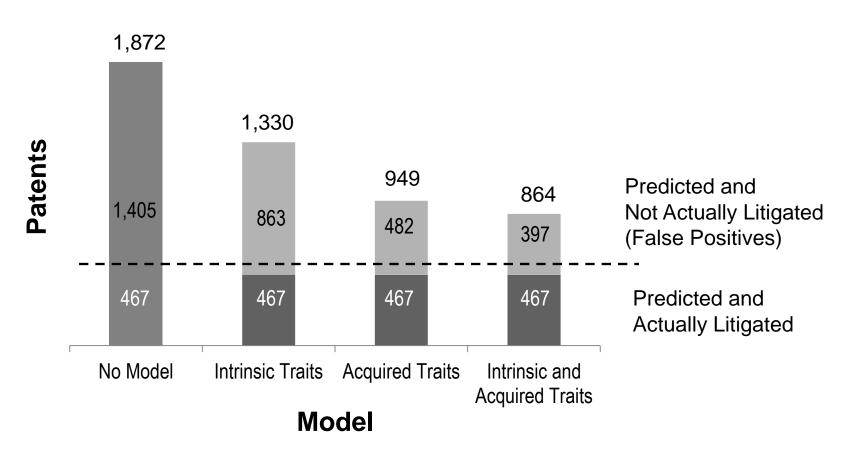
More stars = difference more likely to be real

# Predicted v. Actually Litigated Patents (Time-Series)

| <u>Model</u>                           | Nagelkerke R2    |
|--|------------------|
| Intrinsic Characteristics              | .104             |
| Acquired Characteristics               | .372             |
| Intrinsic and Acquired Characteristics | <sub>-</sub> 418 |

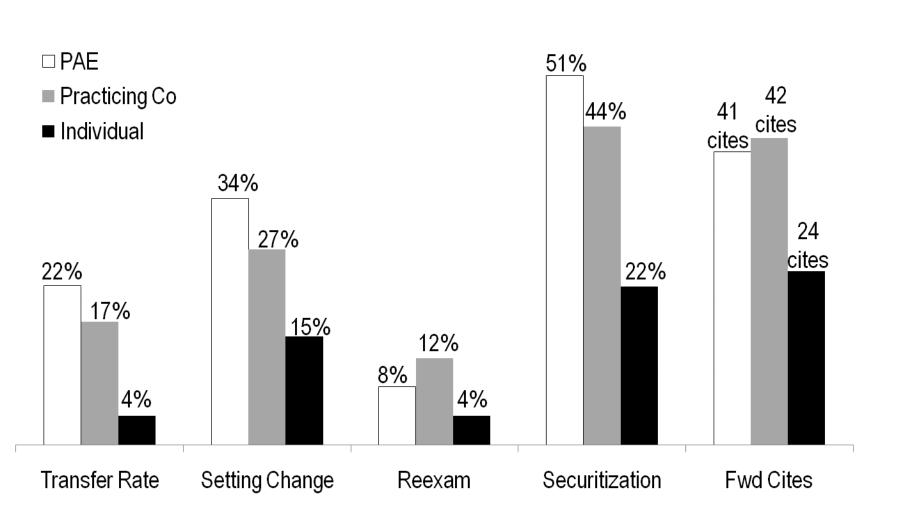
Bigger (R2) is Generally Better

# Payoff: Predicted v. Actually Litigated Patents (Time-Series)



70% observation rate

#### **Differences by Litigant Type**



### **Implications**

#### Potential uses of this work

- Patent Defense 1.0: freedom to operate, R&D planning and decision-making
- Patent Defense 2.0: defensive buying/aggregation, reexamination, insurance

#### **Policy implications**

Patent risk is a function of value and <u>ownership</u>

• A new kind of <u>patent notice failure</u>. Not a problem of what does this patent cover, but who owns the patent, what they do with it. Those transactions aren't required to be recorded, should they be?