

USING DATA EFFECTIVELY:
BEYOND ART AND SCIENCE

MY PATH

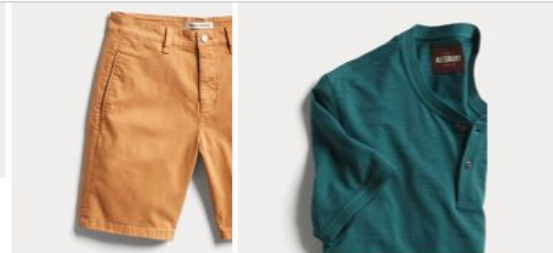
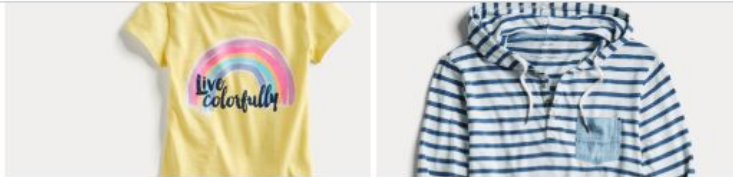
JHU
GRAD SCHOOL



ETSY



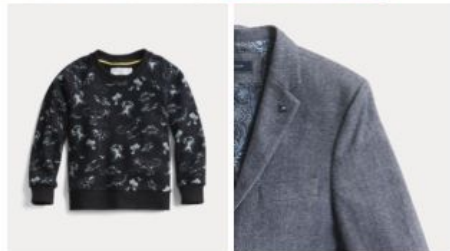
**STITCH
FIX**



STITCH FIX

YOUR PARTNER IN PERSONAL STYLE

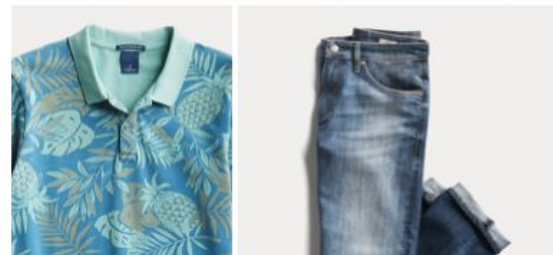
Try the personal styling service for everyone! No matter your age, size or budget we've got styles for you.



WOMEN →

MEN →

KIDS →



CREATE YOUR
STYLE PROFILE

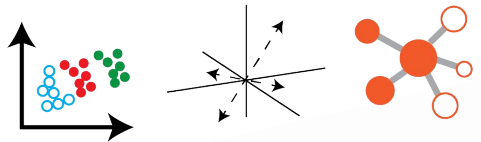


GET 5 HAND
PICKED ITEMS



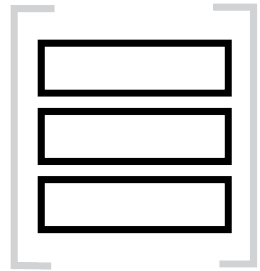
KEEP WHAT YOU LIKE
SEND THE REST BACK

INVENTORY



MACHINE LEARNING

**ALGORITHMIC
RECOMMENDATIONS**



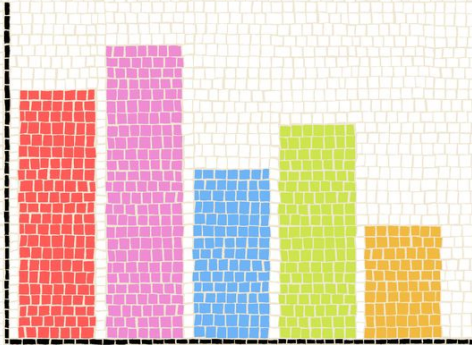
“You’ve told me everything **NOT** to do,
but how will I know what to do?”

-Anonymous Roger Peng student

DATA SCIENCE IS AN ART

The Art of Data Science

A Guide for Anyone Who Works with Data



Roger D. Peng & Elizabeth Matsui

“Data analysis is hard, and part of the problem is that few people can explain how to do it. It’s not that there aren’t any people doing data analysis on a regular basis. It’s that the people who are really good at it have yet to enlighten us about the thought process that goes on in their heads.”

Data Science as an Art

- Intuition
- Qualitative insights
- Exploring a problem through solutions

- “Inspiration exists, but it has to find you working.”
 - Pablo Picasso



Studio, Tony Wilson (1973) my father. <http://www.tonywilsonpainterprintmaker.com/>

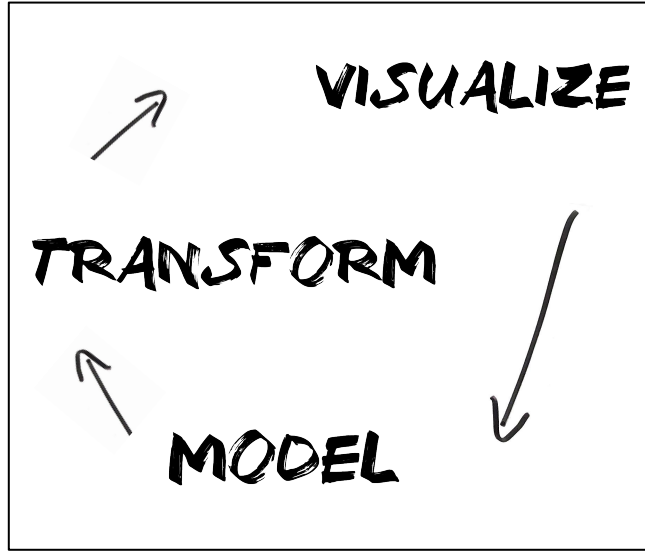
“The demand for this “right” brain thinking is increasing and in era of increased automation, the need for the “art” of data science will be the increasing cry of business.”



The Art of Data Science

By: Richard Boire, Senior Vice President, [EnvironicsAnalytics](#)

IMPORT → TIDY →



→ COMMUNICATE

EXPLORE

IF DATA SCIENCE IS AN ART,
WHY DON'T WE TEACH IT
LIKE AN ART?



STUDENTS & FACULTY ▾

ALUMNI ▾

BALTIMORE COMMUNITY ▾

PREPARATORY

CONCERTS & EVENTS

NEWS

GIVING



JOHNS HOPKINS
PEABODY INSTITUTE

EXPLORE PEABODY

APPLY & AUDITION

FACULTY

ACADEMICS

LIFE AT PEABODY

Degrees & Programs

Instruments & Areas of Study

Breakthrough Curriculum

Ensembles

Study Abroad

Academic Calendar & Resources

Peabody at Homewood

World Class Means You
Move the World

▾ Scroll to continue exploring this theme.



Brass

Trumpet, French Horn, Trombone, Tuba, Euphonium



Guitar



Harp



Piano



Organ



Percussion



Strings

Violin, Viola, Cello, Double Bass



Woodwinds

Flute, Piccolo, Clarinet, Saxophone, Oboe, Bassoon





Music Theory Pedagogy



The Department of Music Theory, including the affiliate areas of Ear-Training and Keyboard Studies, strives to intensify the musicianship of conservatory students and provide the required skills for a profound and concentrated understanding of music.

[LEARN MORE](#)

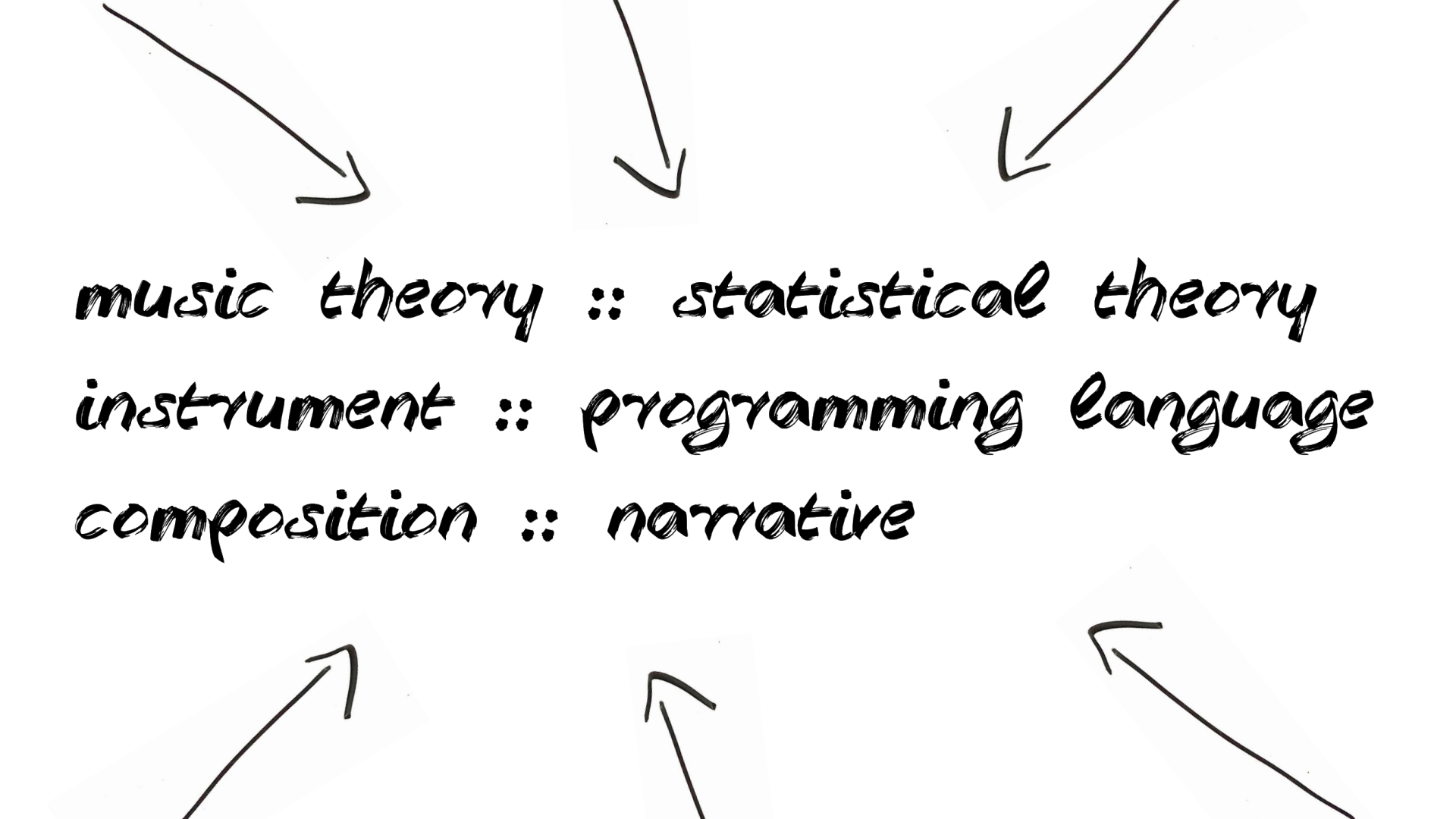


Composition



Regarded as among the world's elite training grounds for more than a century, the department of composition at Peabody is one of the most sought after programs of its kind in the world. As a division of The Johns Hopkins University, Peabody takes its place alongside the institution's other internationally renowned centers of research and learning, shaping the role of music in the 21st century.

[LEARN MORE](#)



music theory :: statistical theory
instrument :: programming language
composition :: narrative

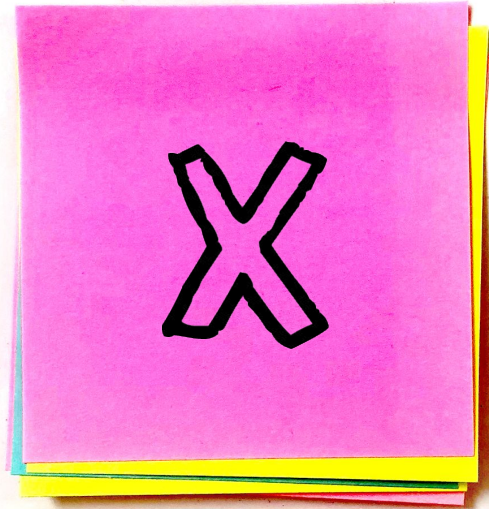
music theory :: statistical theory

music theory :: statistical theory



instrument :: programming language

instrument :: programming language



MOSTLY:

WHAT I'VE LEARNED FROM YOU



PROGRAMMING
IN R



FOR PURELY
STATISTICAL/ACADEMIC
PURPOSES

LIMITS CREATIVITY

COOK-BOOKERY

Architecture

ProjectTemplate is based on the idea that you should structure all of your data analysis projects in the same way so that you can exploit conventions instead of writing boilerplate code. Because so much of ProjectTemplate's functionality is based on conventions, it's worth explaining ProjectTemplate's idealized project in some detail.



**TOOK THE COGNATIVE
BURDEN OFF OF FORMATTING**



**LIKE RUBY ON RAILS, BUT
FOR ANALYSIS CODE**

ETSY

DEVOPS

**BLAMELESS
POST-MORTEM**



GOOD ANALYST V. BAD ANALYST

You re-run the analysis and get different results.

Someone else can't repeat the analysis.

You can't re-run the analysis on different data.

An external library you're using is updated, and you can't recreate the results.

You change code but don't re-run downstream code, so the results aren't consistently updated.

You change code but don't re-execute it, so the results are out of date.

You update your analysis and can't compare it to previous results.

You can't point to code changes that resulted in a different analysis results.

A second analyst can't understand your code.

Can you re-use logic in different parts of the analysis?

You change the logic used in analysis, but only in some places where it's implemented.

Your code is not performing as expected, but you don't notice.

Your data becomes corrupted, but you don't notice.

You use a new dataset that renders your statistical methods invalid, but you don't notice.

You make a mistake in your code.

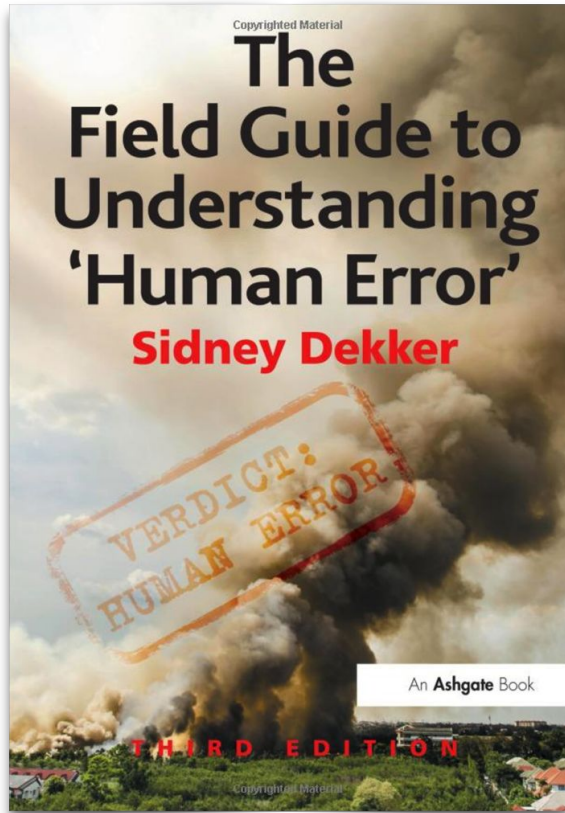
You use inefficient code.

A second analyst wants to contribute code to the analysis, but can't do so.

Two analysts want to combine code but cannot.

You aren't able to track and communicate known next steps in your analysis.

Your collaborators can only make requests in email or meetings, and they aren't incorporated into the project.



“An engineer who thinks they’re going to be reprimanded is disincentivized to give the details necessary to get an understanding of the mechanism, pathology and operation of the failure.”

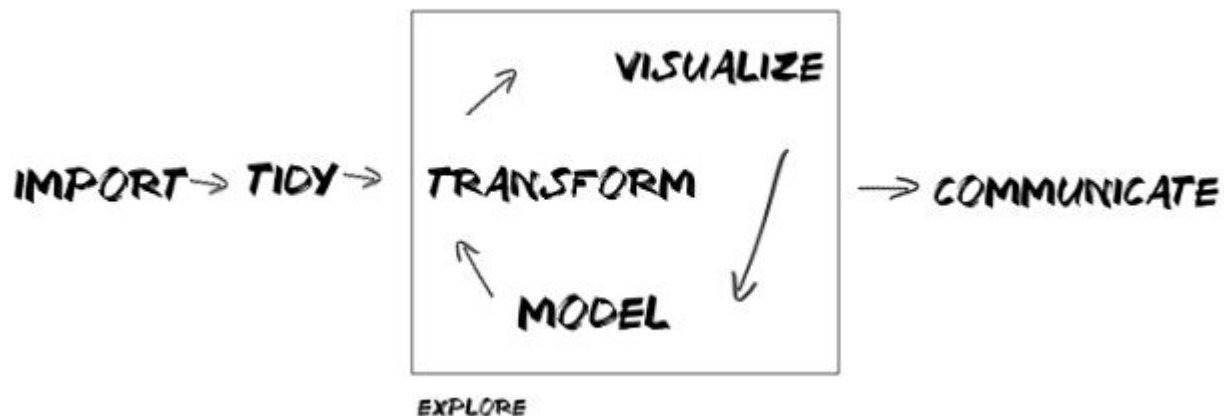
– John Allspaw

BLAMELESS PORTMORTEMS

ALLOWED ME TO TALK
ABOUT CONCEPTS IN A WAY
THAT DIDN'T MAKE PEOPLE
DEFENSIVE

ALLOWED ME TO TALK ABOUT
GENERAL PRINCIPLES RATHER
THAN SPECIFIC LANGUAGE CHOICES

BUILDING A SYSTEM



I HEDGED MY BETS



“the purpose of this paper is to established the opinions for developing the technical artifact, rather than developing the narrative of an analysis.”

AND LEFT THE NARRATIVE OUT

Opinionated Analysis Development

Hilary Parker

Stitch Fix

hparker@stitchfix.com

August 30, 2017

Motivation

Background

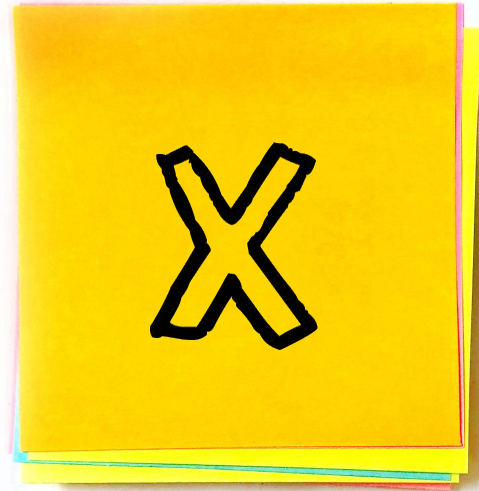
Statistical software is, at its core, a language one uses to create a convincing analysis. The final creative product is a narrative that will address a scientific or business question in a way deemed satisfactory. Within a scientific setting, this generally will be developing a narrative that allows a scientific finding to be published in a peer-reviewed setting. In a business setting, there are myriad endpoints for an analysis, but most serve the purpose of helping business partners make a decision. Folded into this narrative is the choice of experimental approach and statistical methods with known properties that convincingly model or approximate the data.

As with any mode of expression, a practitioner must first learn the technical skill of the trade before they can use it to create. A photographer must learn how to manage the aperture, shutter speed, and numerous other features of a camera that control light exposure before she can use the tool to create unique and affecting photographs. The statistical analog for this – and the focus of this paper – is the process of creating the technical artifact using the statistical language and other tools, that delivers the analysis narrative to interested parties. In a scientific setting, the technical artifact is often a journal article. Within a business setting, the technical artifact may be a quick email, a slide deck, a white paper or a long-lived dashboard. In all these creative fields, increased fluency and mastery of the tooling means that the practitioner can create uninhibited.

Statistical training often focuses on the narrative aspects of this process: mathematical derivations and proofs of statistical tests, methods and models. This foundational training is crucial to understanding the strengths and limitations of conclusions that can be drawn from a particular approach to analyzing data. However, the process of developing the technical artifact is less frequently taught, or even acknowledged as a set of necessary skills. Given that this process is complex and prone to error, this hampers practitioners, keeping them from establishing fluency in the tools and allowing them to make common, avoidable and time-consuming mistakes. The purpose of this paper is to present clear opinions on how, technically, an analysis should be developed, drawing from recent developments in related fields, available tooling and common best practices.

composition :: narrative

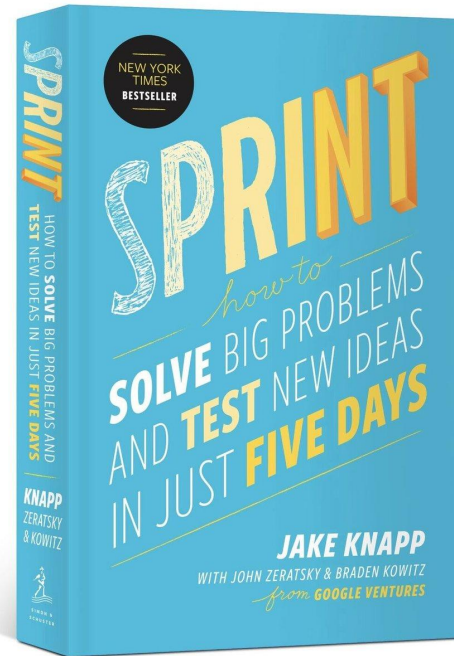
composition :: narrative



Software is the invisible writing that whispers the stories of possibility to our hardware. You are the storyteller.

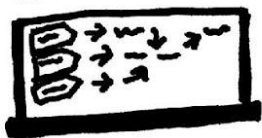
Grady Booch

PRODUCT DEVELOPMENT



MONDAY

•Map



TUESDAY

•Sketch



WEDNESDAY

•Decide



THURSDAY

•Proto-
type



FRIDAY

•Test



INTERVIEW STAKEHOLDERS

RAPID PROTOTYPING

CRAFT SOLUTIONS TO THEIR PROBLEMS

HAVE A THOUGHTFUL WAY OF DISCUSSING IDEAS

WORK ALONE TOGETHER





Handwritten notes on the top left of the glass wall, including a list of items and a small diagram.

A cluster of orange sticky notes in the middle-left section of the wall, containing various short notes.

A group of orange and pink sticky notes in the upper-middle section, some with larger text and diagrams.

Orange sticky notes in the middle-right section, including one with a list of points.

A vertical column of orange sticky notes on the lower-left side of the glass wall.

A cluster of orange sticky notes in the lower-middle section, containing detailed handwritten notes.

Pink and orange sticky notes in the upper-right section, including one with a small diagram.

A vertical column of orange and pink sticky notes in the lower-middle-right section.

Orange and pink sticky notes in the top-right corner, including one with a diagram.

A vertical column of orange and pink sticky notes in the lower-right section.

Orange and pink sticky notes in the lower-right section, including one with a list.

Pink and orange sticky notes in the top-right corner, including one with a grid pattern.

Orange and pink sticky notes in the lower-right section, including one with a list.

Orange and pink sticky notes in the bottom-right corner, including one with a list.

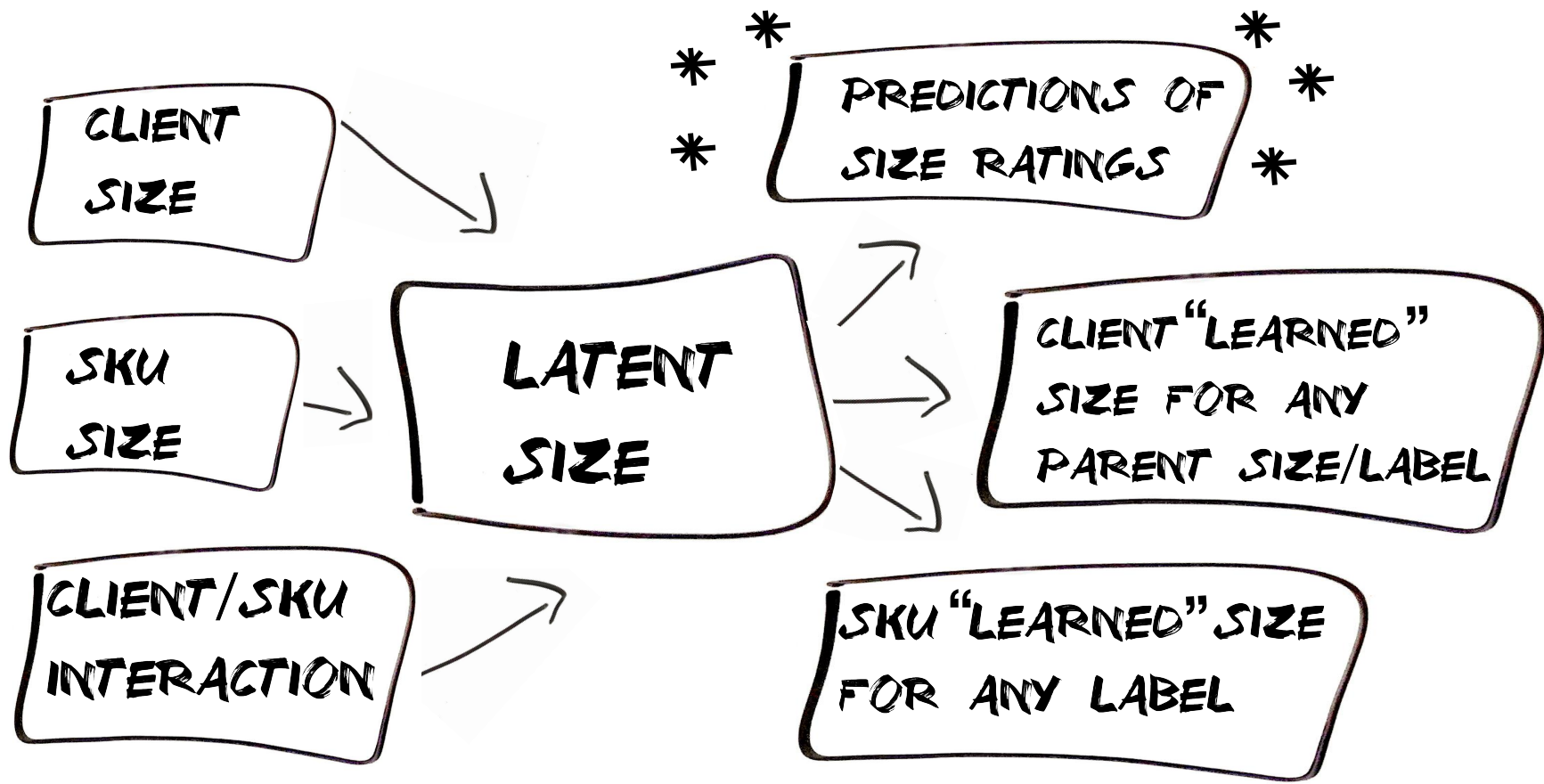
RULES

MERCH
INTENT

FIT
•
•
•
AESTHETICS

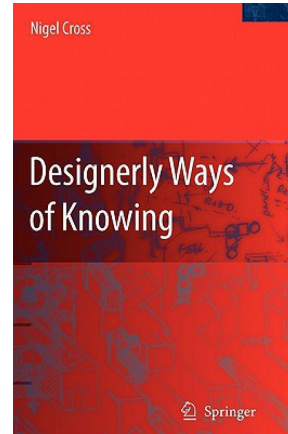
BRAND
•
LOYALTY

w/in
size
variation



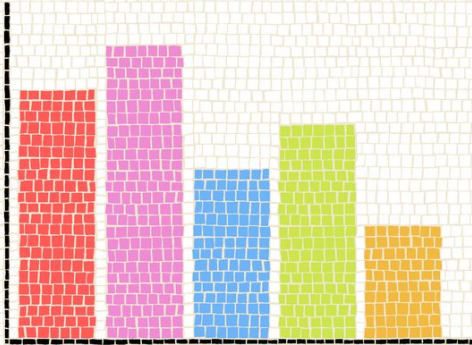
DESIGN IS NOT A "MYTHICAL"
OR "MYSTERIOUS TALENT"

IT'S A DISCIPLINE →



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THE DESIGN PROCESS



**SOLUTION-
FOCUSED**



**AS OPPOSED
TO PROBLEM
FOCUSED**

“You’ve told me everything **NOT** to do, but how will I know what to do?”

Anonymous Roger Peng student

THE DESIGN PROCESS

CONSTRUCTIVE
THINKING



YOU NEED TO
START BUILDING
TO UNDERSTAND
THE PROBLEM
FULLY

Data Science as an Art

- Intuition
- Qualitative insights
- Exploring a problem through solutions

- “Inspiration exists, but it has to find you working.”
 - Pablo Picasso



Studio, Tony Wilson (1973) my father. <http://www.tonywilsonpainterprintmaker.com/>

THE DESIGN PROCESS

USES RIGHT
AND LEFT
BRAIN

“The demand for this “right” brain thinking is increasing and in era of increased automation, the need for the “art” of data science will be the increasing cry of business.”



The Art of Data Science

By: Richard Boire, Senior Vice President, [EnvironicsAnalytics](#)

THE DESIGN PROCESS

A FORM OF
NONVERBAL
RHETORIC

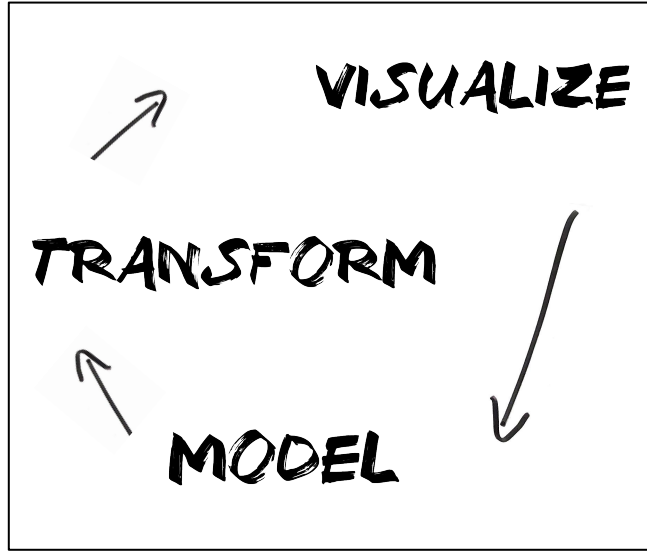


WITH SKETCHING
AS THE LANGUAGE

One thing that is clear is that sketches enable designers to handle different levels of abstraction simultaneously... Clearly this is something important in the design process. We see that designers think about the overall concept and at the same time think about detailed aspects of the implementation of that concept.

Nigel Cross

IMPORT → TIDY →



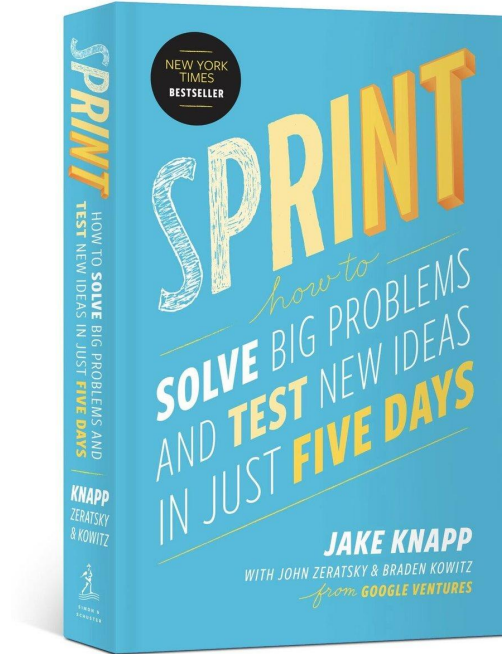
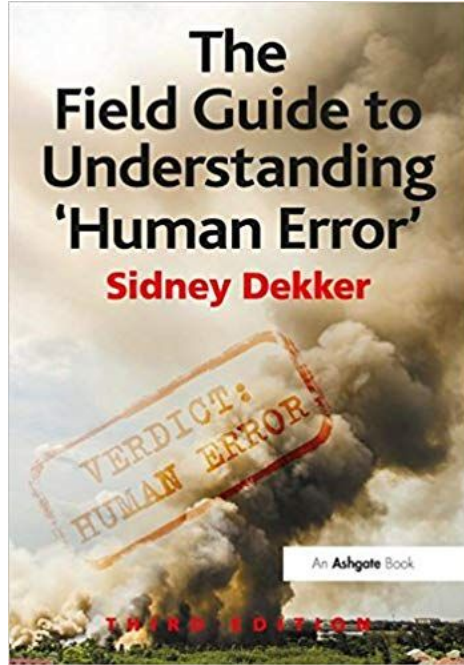
→ COMMUNICATE

EXPLORE

Design ability is, in fact, one of the three fundamental dimensions of human intelligence. Design, science, and art form an ‘and’ not an ‘or’ relationship to create the incredible human cognitive ability.”

Nigel Cross

WHAT DO THEY HAVE IN COMMON



TWO SIDES OF THE SAME COIN



RULES FOR PLAYING NICE



EMPATHY

the capacity to understand or feel what another person is experiencing from within their frame of reference, i.e., the capacity to place oneself in another's position.

effective teams



<https://rework.withgoogle.com/blog/five-keys-to-a-successful-google-team/>

WHAT IF YOU ARE NOT AN
EMPATHETIC PERSON ?

MY EXPERIENCE WITH MEDITATION



```
graph TD; A[MEDITATION] --> B[CURIOSITY]; A --> C[NON-JUDGMENTAL OBSERVATION];
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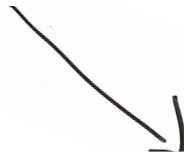
MEDITATION

CURIOSITY

**NON-JUDGMENTAL
OBSERVATION**

ACCEPTANCE

SELF



OTHERS



EMPATHY



WITH USERS



WITH CO-CREATORS



WITH SELF

THANK YOU