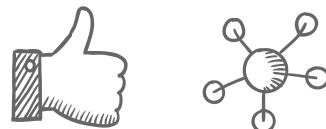


# UX & AI

How we used UX to improve AI:  
Case studies where UX played a  
role in the design of better AI

by Jordan Deja

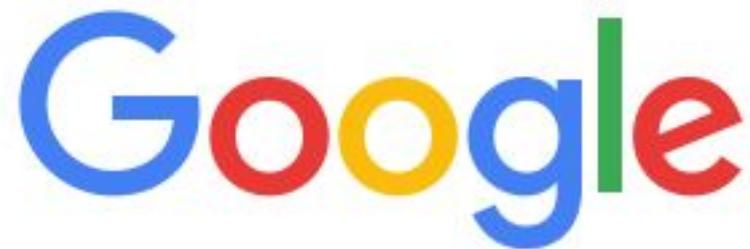
UST IICS | 04 013 2019 | @jrdndj





MAKE GIFS AT GFSOUP.COM

the two types of people listening to my talk...



cramming professor meme

Google Search

I'm Feeling Lucky

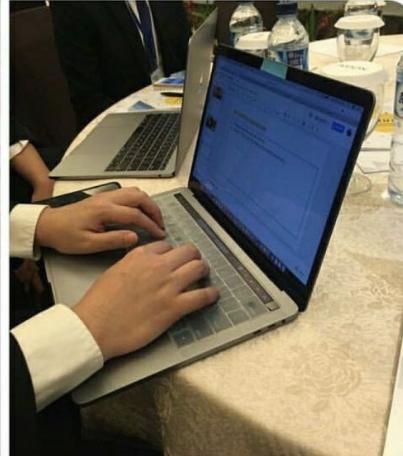
Google offered in: [Filipino](#) [Cebuano](#)



Blaise Cruz  
@finelined\_

▼

If you think you're good at cramming,  
my prof makes his slides and prepares  
his presentation for an international  
conference IN THE CONFERENCE  
ITSELF





# Hello, I'm Jordan!

My name is Jordan Deja.

I'm a ~~slavedriver~~ student motivator @ DLSU

@jrdndj

#### Previous Affiliations:

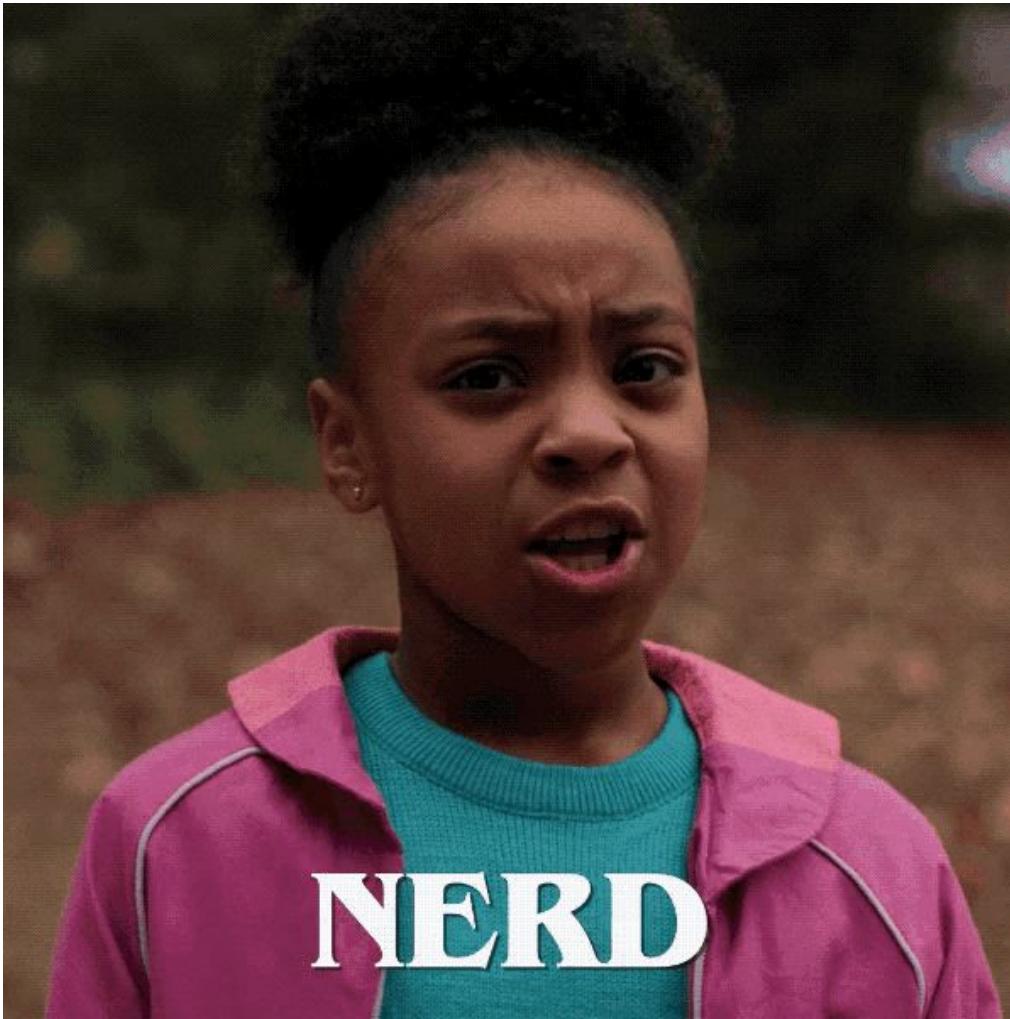
Instructor, UST  
Project Mgr, Senti Tech Labs  
Instructor, MCL  
Computer Teacher, LBASS  
Jr Project Mgr, HP AP ROHQ

#### Education/Training:

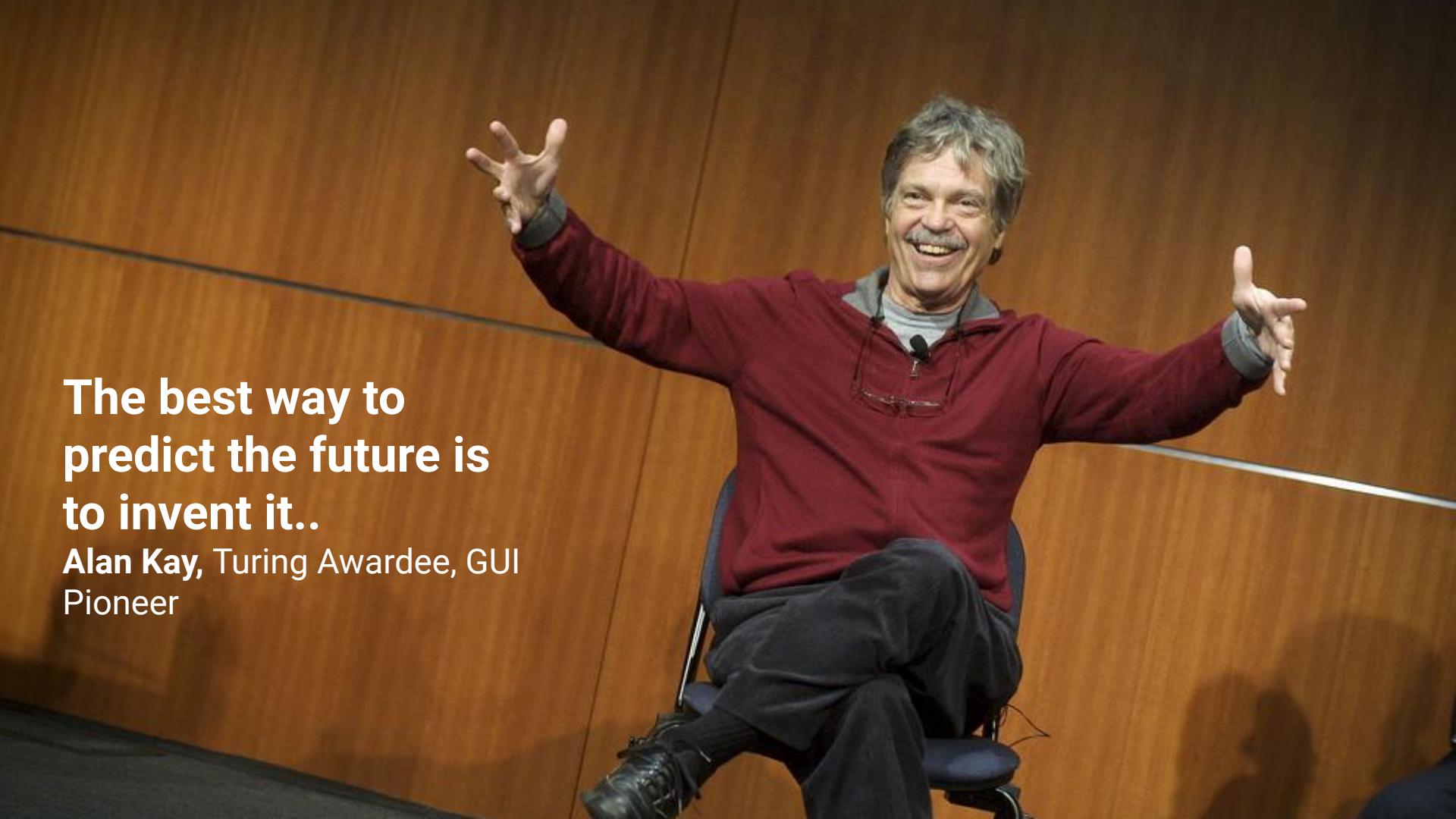
Visiting Scientist, Osaka University  
MSCS, De La Salle University  
BSCS, De La Salle Canlubang

#### Current Affiliations:

Assistant Professor, DLSU CCS  
Head, DLSU COMET  
Core, UXPH  
Member, ACM SIGCHI



NERD

A photograph of Alan Kay, a man with a mustache and grey hair, smiling and sitting in a black office chair. He is wearing a maroon zip-up hoodie over a grey t-shirt. His arms are raised and extended wide to his sides. The background is a warm-toned wooden wall.

**The best way to  
predict the future is  
to invent it..**

**Alan Kay, Turing Awardee, GUI  
Pioneer**

“if you aren’t aligned with  
a human need, you’re  
just going to build a very  
powerful system to  
address a very small—or  
perhaps  
nonexistent—problem.

- Lovejoy (2018)



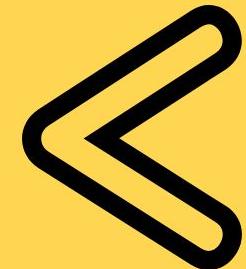
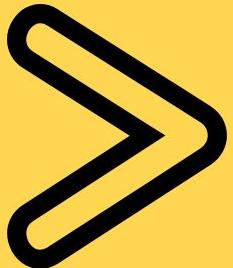
what's  
UX?

**Lets begin with an activity:**

STAND UP!

GRAB A PARTNER!

FACE YOUR  
PARTNER!



1 - 2

1 - 2 - 3



HUMANS DONT LIKE BREAKING THE  
PATTERN

# CONSISTENCY IS A PATTERN

breaking patterns make things  
harder

1 - 2 - 3 - 4

ON HUMANS AND LONG THINGS

# LONGER IS NOT ALWAYS HARDER IF THERE ARE PATTERNS

It is not all the time that long is ayt. It is not all the time  
short is better.

## CONTACT US

If you would like to get ahold of us,  
please fill in the form below...

**Salutation** (optional)

Mr.

**First and Last Name**

**Company or Organization** (optional)

**Email Address**

**Phone Number** (optional)

1 (  )  -

**Fax Number** (optional)

1 (  )  -

**Subject or Topic**

Technical support

**Comments or Questions**

**Newsletter** (optional)

Yes, I would like to receive a  
monthly newsletter about deals and  
offers!

## CONTACT US

If you would like to get ahold of us,  
please fill in the form below...

**Name**

**Email Address**

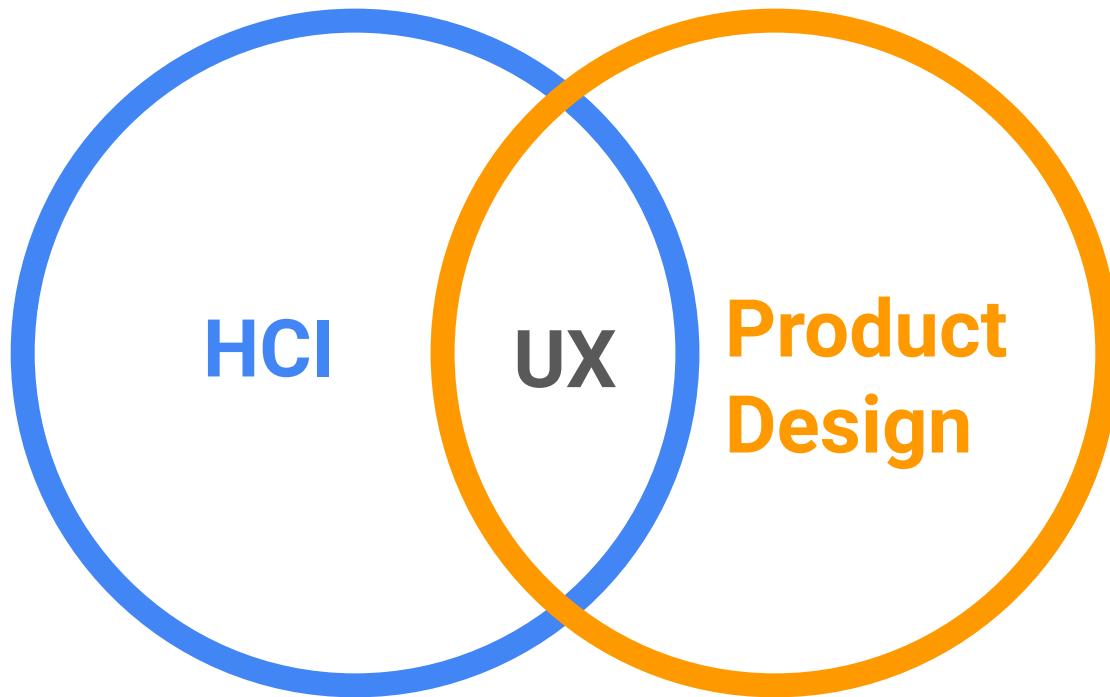
**Comments or Questions**

**1 - CLAP - 3**

**JUMP - CLAP - 3**

# JUMP - CLAP -





# **UX&UI**

**Let's remove the 'U', what  
do we have left?**

# **UX&UI**

**Experiences  
Interfaces**

**Let's remove the 'U', what  
do we have left?**

# UX & HCI

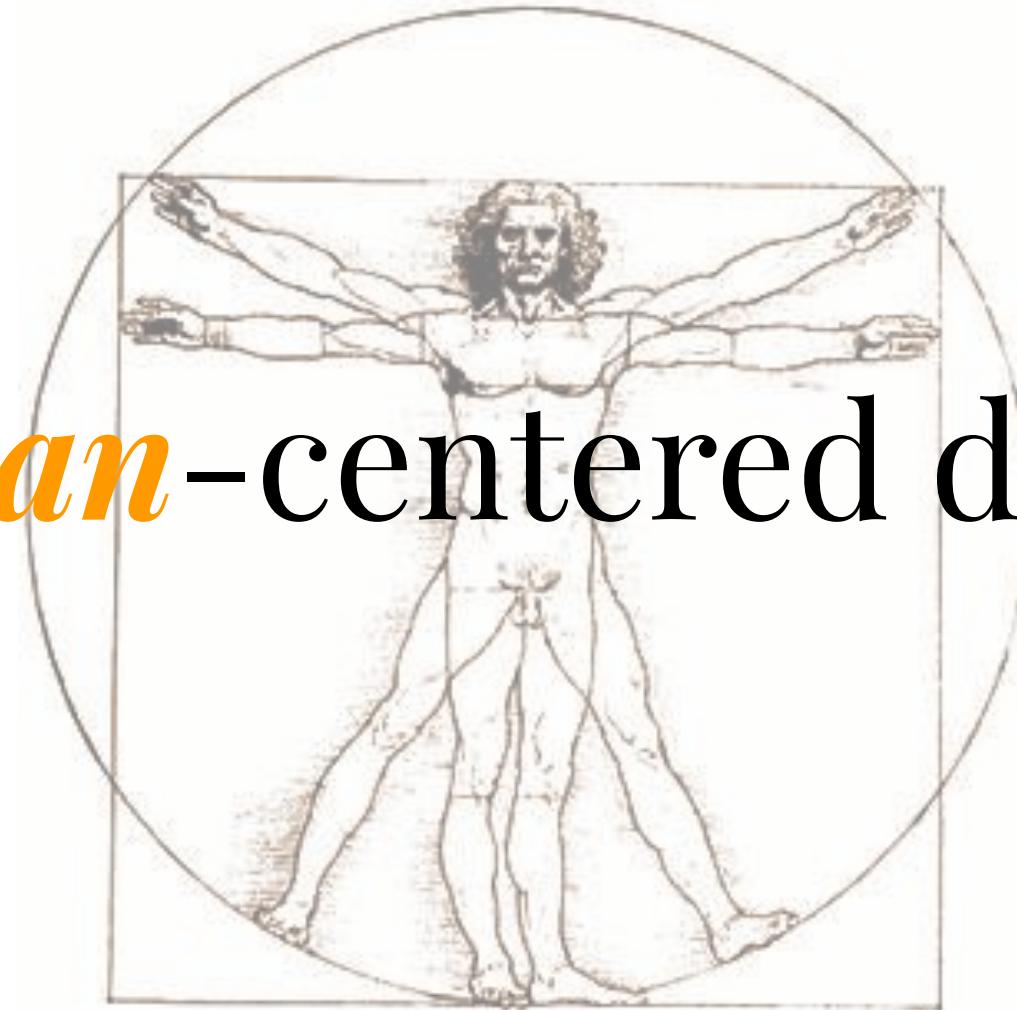
Let's look at the first words  
shall we?

# UX & HCI

User Experience  
Human Computer  
Interaction

Let's look at the first words  
shall we?

*human*-centered design



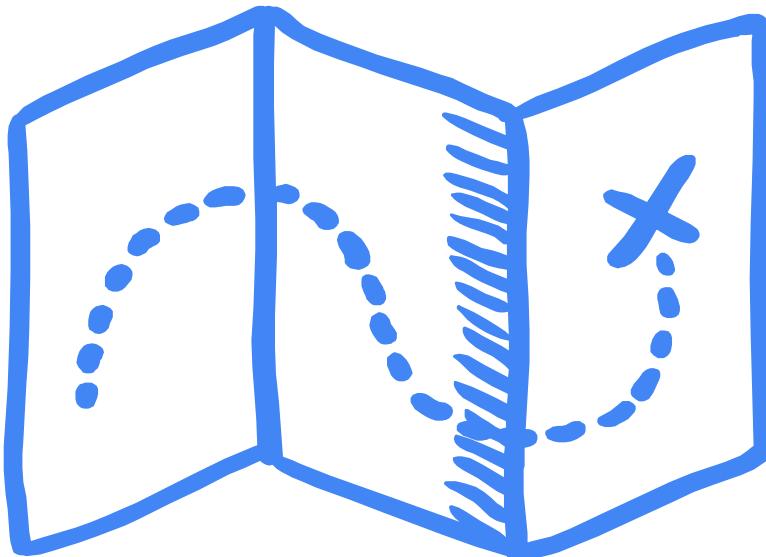


Vox

# UXareas

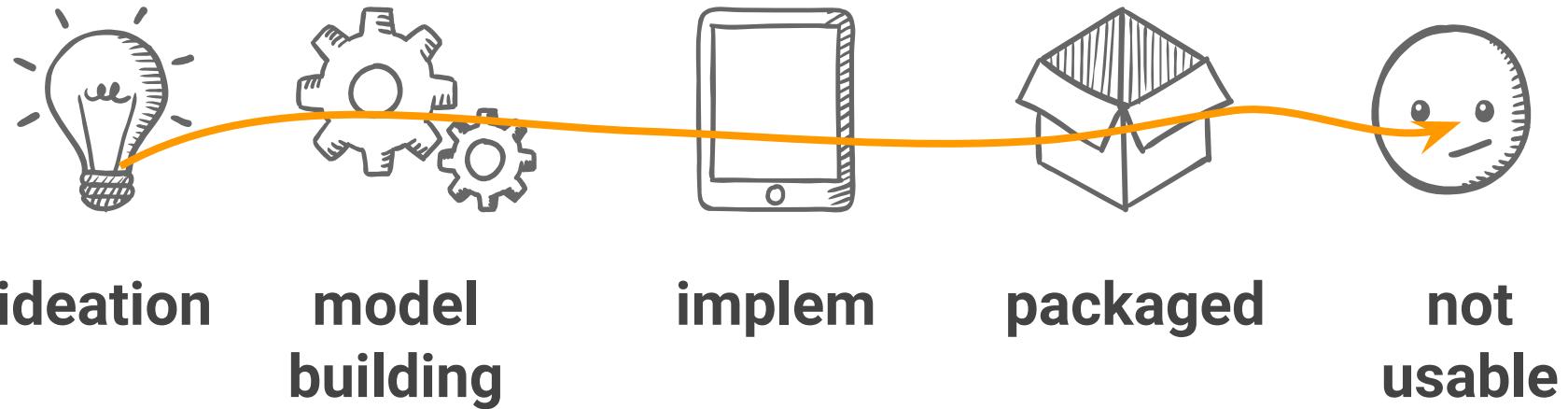
**Experience Design**  
**Interaction Design**  
**User Research**  
**Visual Design**  
**Information Architecture**  
**Service Design**  
**Product Design**

# the product journeys of

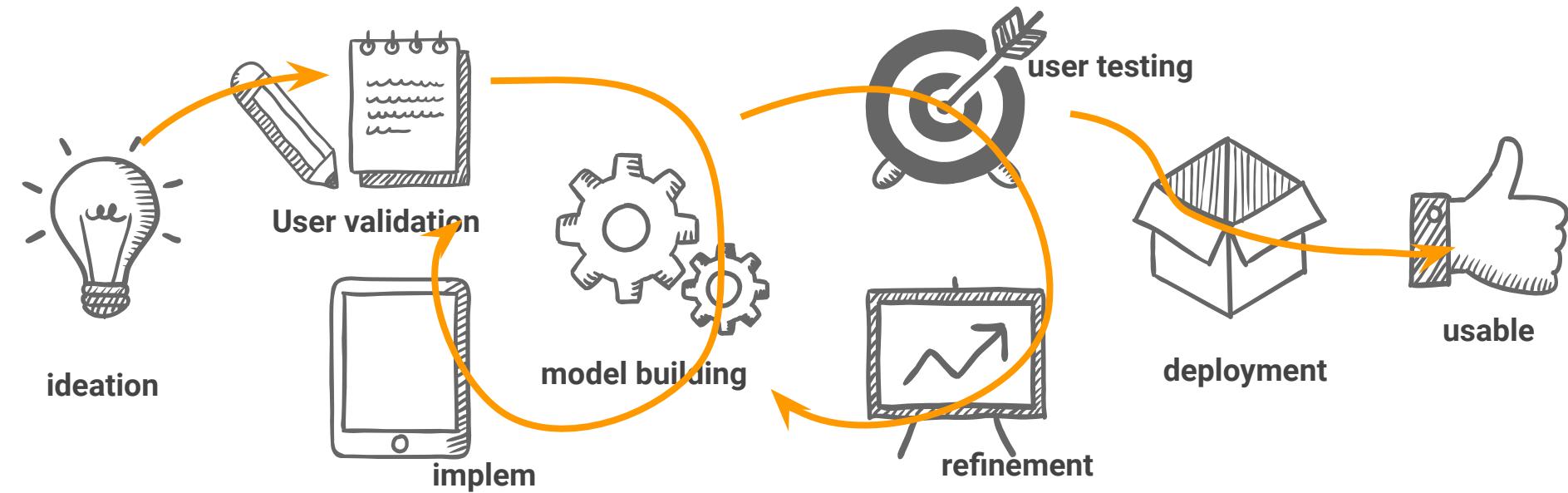


## an AI product

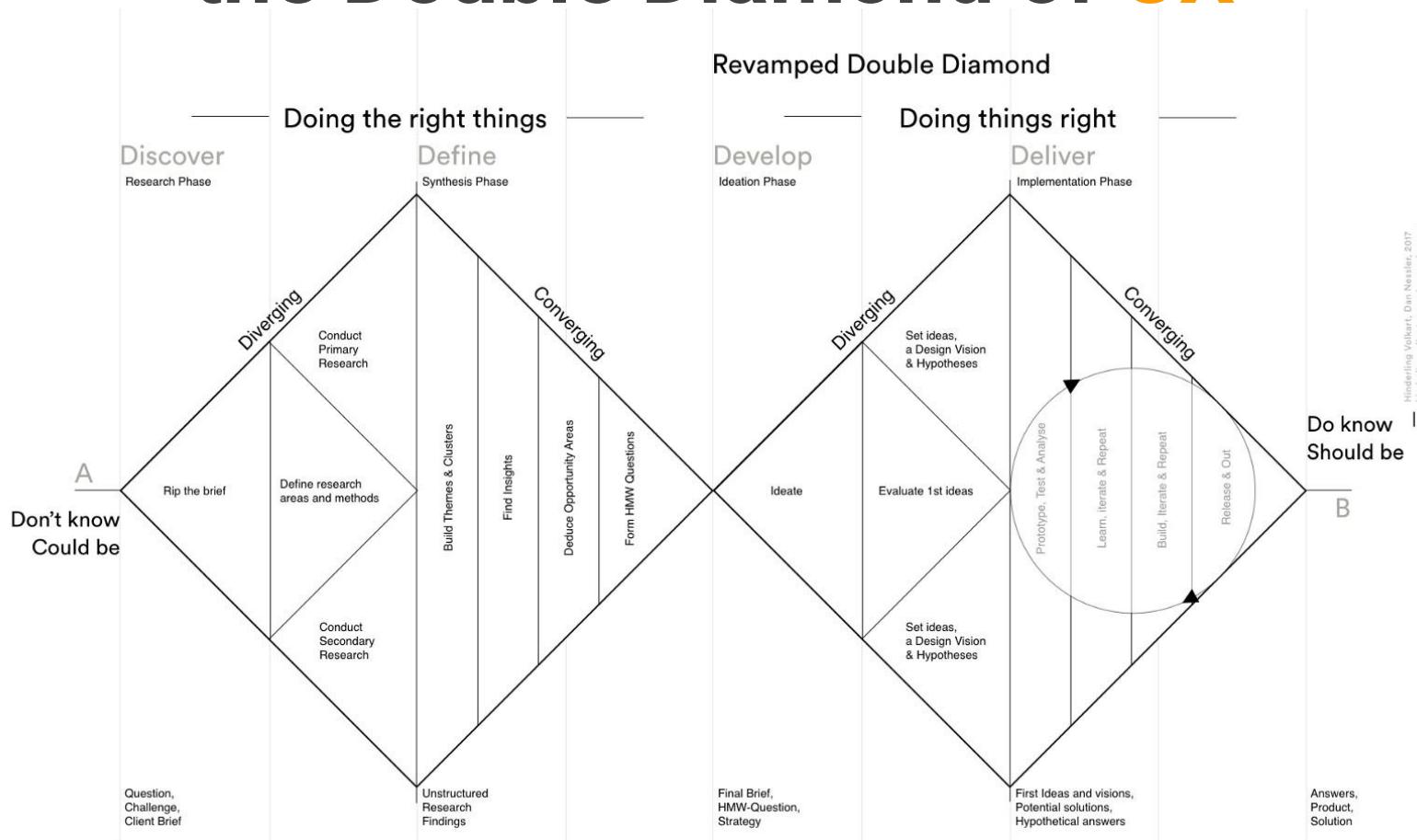
# the typical design journey of an AI product



# the ideal design journey of a usable AI product



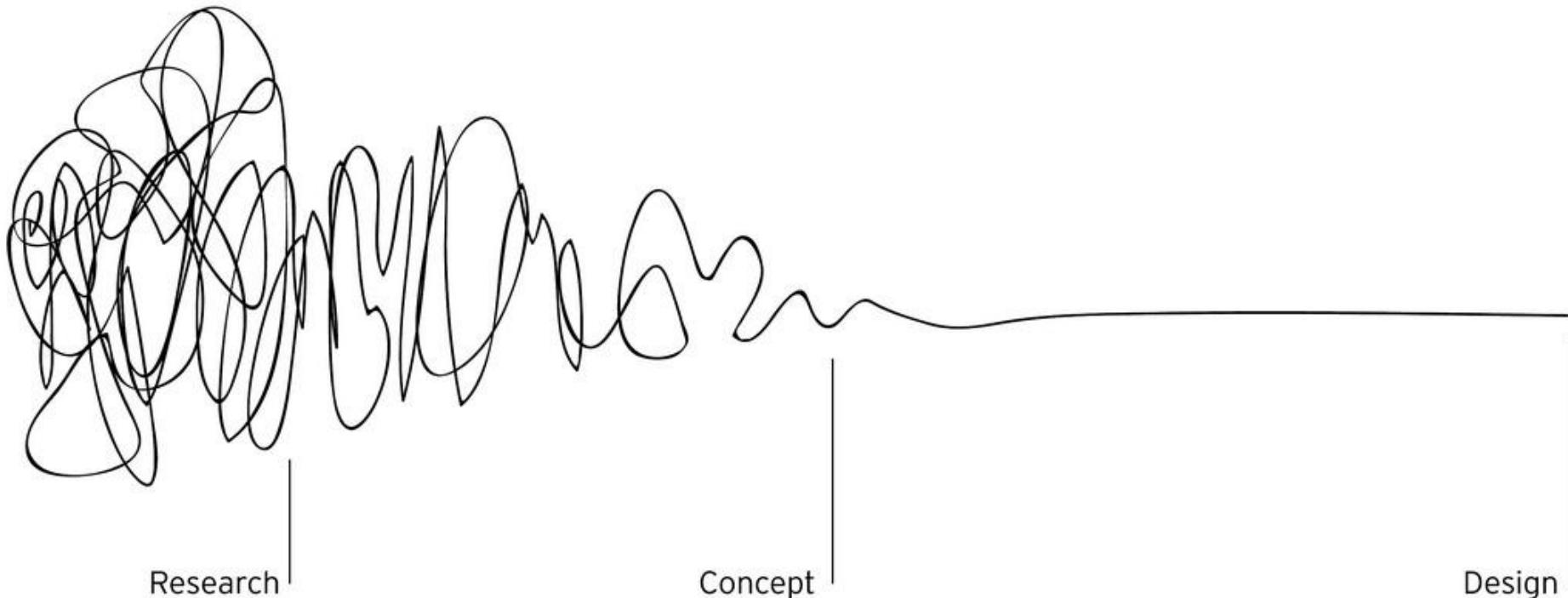
# the Double Diamond of UX



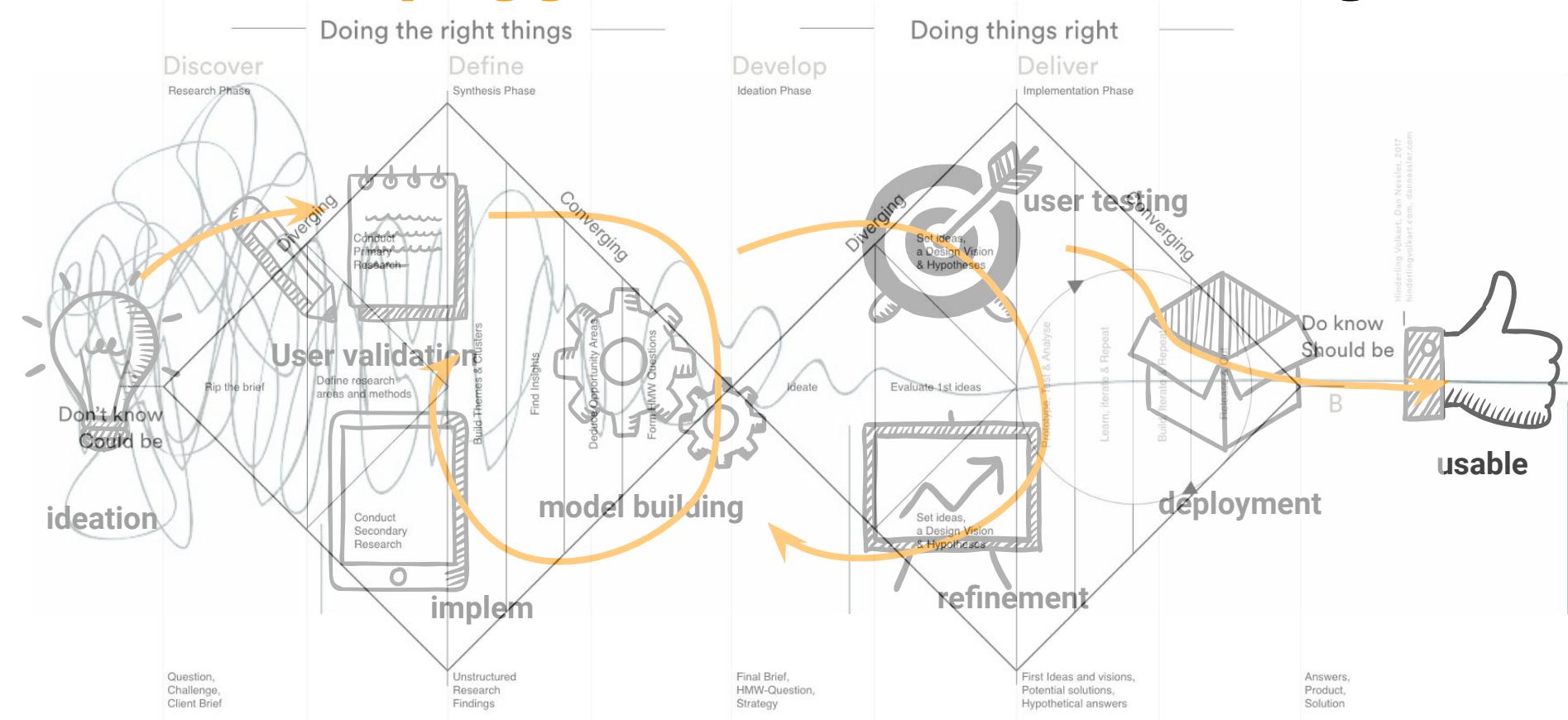
# UX Squiggle

Uncertainty / patterns / insights

Clarity / Focus



# “UX Squiggle” in AI Product Design



# specific UX methods for a usable AI product



Participatory  
design



User  
inspection



eye  
tracking



A/B  
Testing



Customer  
feedback



field studies

And many  
more...

# Didn't we mention a usable, sustainable AI product?



solves a  
problem

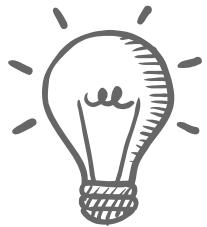


is a usable  
product



profitable,  
provides  
opportunities

# Didn't we mention a usable, sustainable AI product?



solves a  
problem



is a usable  
product



does not kill  
jobs

profitable,  
provides  
opportunities

# What should be the journey towards a usable, sustainable AI product?



solves a  
problem

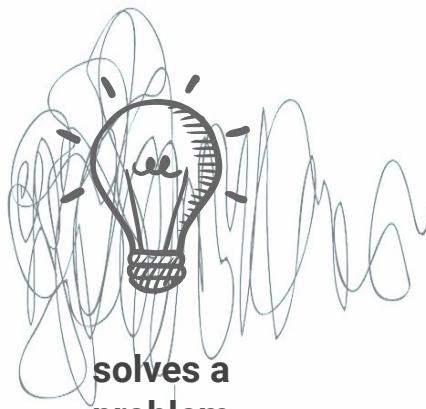


is a usable  
product



profitable,  
provides  
opportunities

# What should be the journey towards a usable, sustainable AI product?



solves a  
problem

Just add UX!

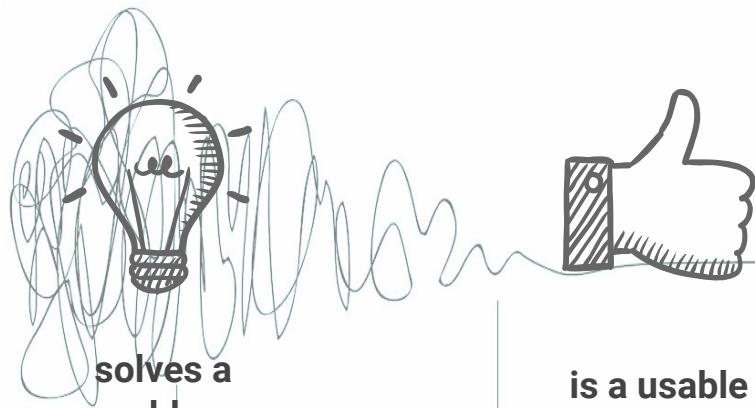


is a usable  
product



profitable,  
provides  
opportunities

# What should be the journey towards a usable, sustainable AI product?



solves a  
problem

Just add UX!



is a usable  
product



profitable,  
provides  
opportunities

Even more UX!

# +specific UX methods for a sustainable AI product



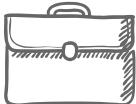
Journey  
mapping



Service  
blueprint



personas



business  
origami

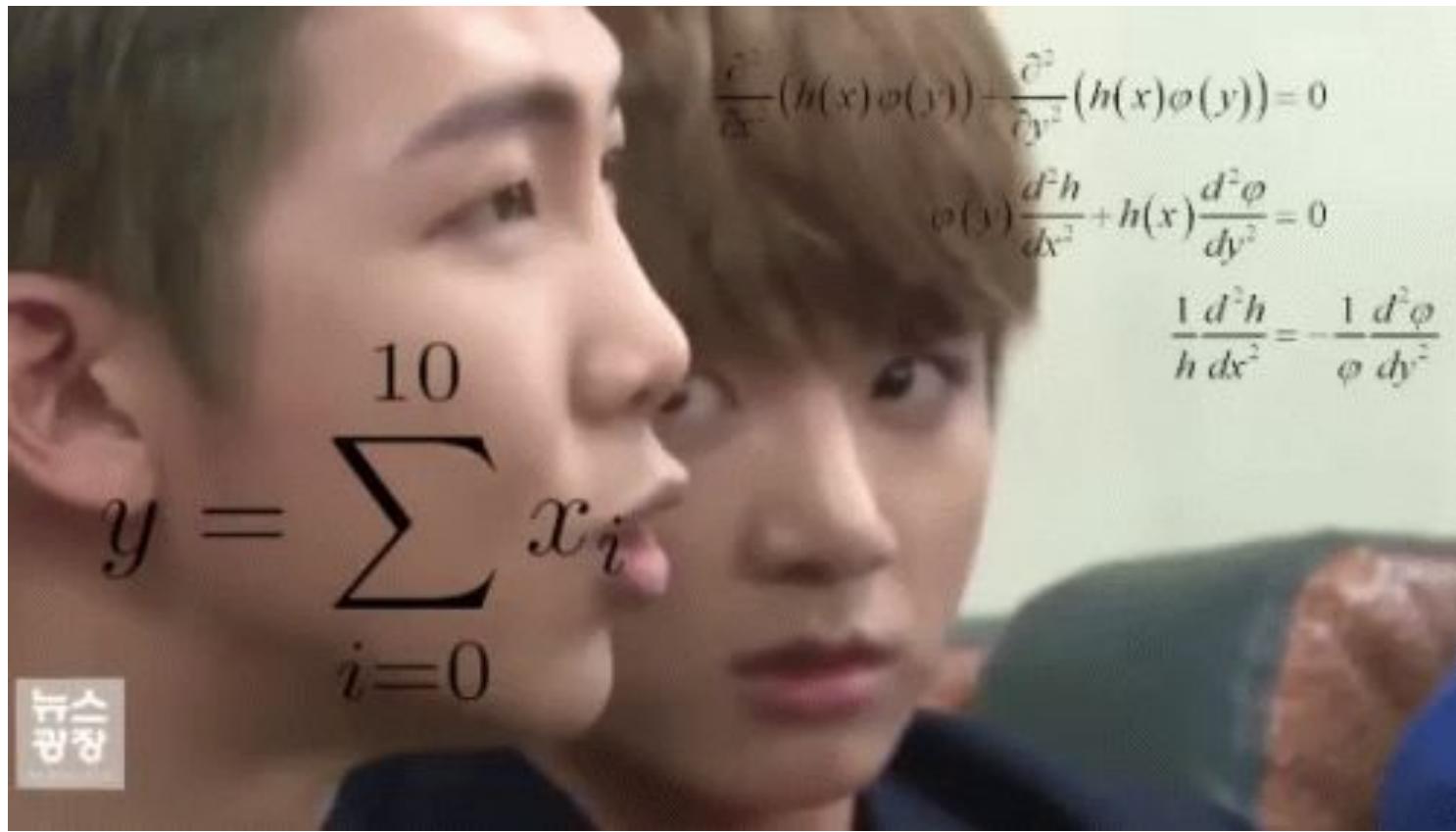


AIDA  
Storyboarding



User empathy  
and value  
proposition

And many  
more...



Me thinking if this will even work in real life?

# Design Challenge

Form groups composed of at most 4 members each. Assume that you are in the scenario.

Individually:

Write each idea you think of in your post-it.

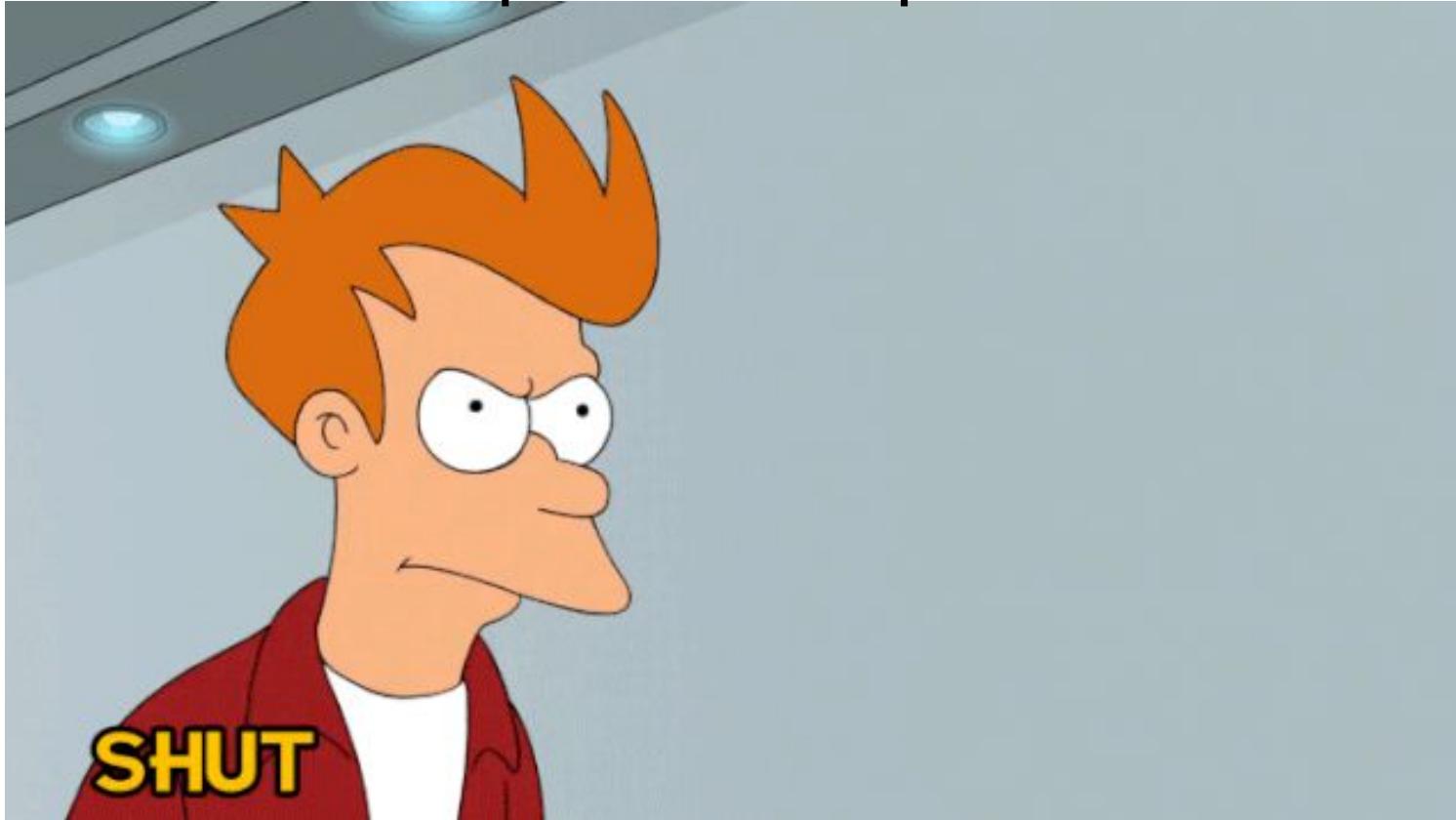
As a group:

Discuss and collaborate on your ideas.  
Then sketch and present your findings.

# Design Challenge

I want to book a flight online because there is an ongoing sale. However, due to server issues, I cannot book a flight properly. My company thinks we should develop a FB Chatbot to solve this problem. How might we design a chatbot to address this scenario?

Is there an example of such product? If so then...



**Draco: animating  
drawings using kinetic  
motions**

[https://www.youtube.com/watch?v=l84YK1\\_ytks&list=PLI81bJ6jBktwh0BrSYn2prx9WQ7GnJDPK&index=3](https://www.youtube.com/watch?v=l84YK1_ytks&list=PLI81bJ6jBktwh0BrSYn2prx9WQ7GnJDPK&index=3)



**Em-sense: combining  
Wearables and  
machine learning for  
context sensing**

<https://www.youtube.com/watch?v=fpKDNle6ia4>



# **MyoSL: a usable gesture-based Filipino Sign Language interpreter**



SCEPTRE (Paudyal et. Al, 2016)





**DeepDive: combining  
marketing  
and science using  
brainwaves and AI**

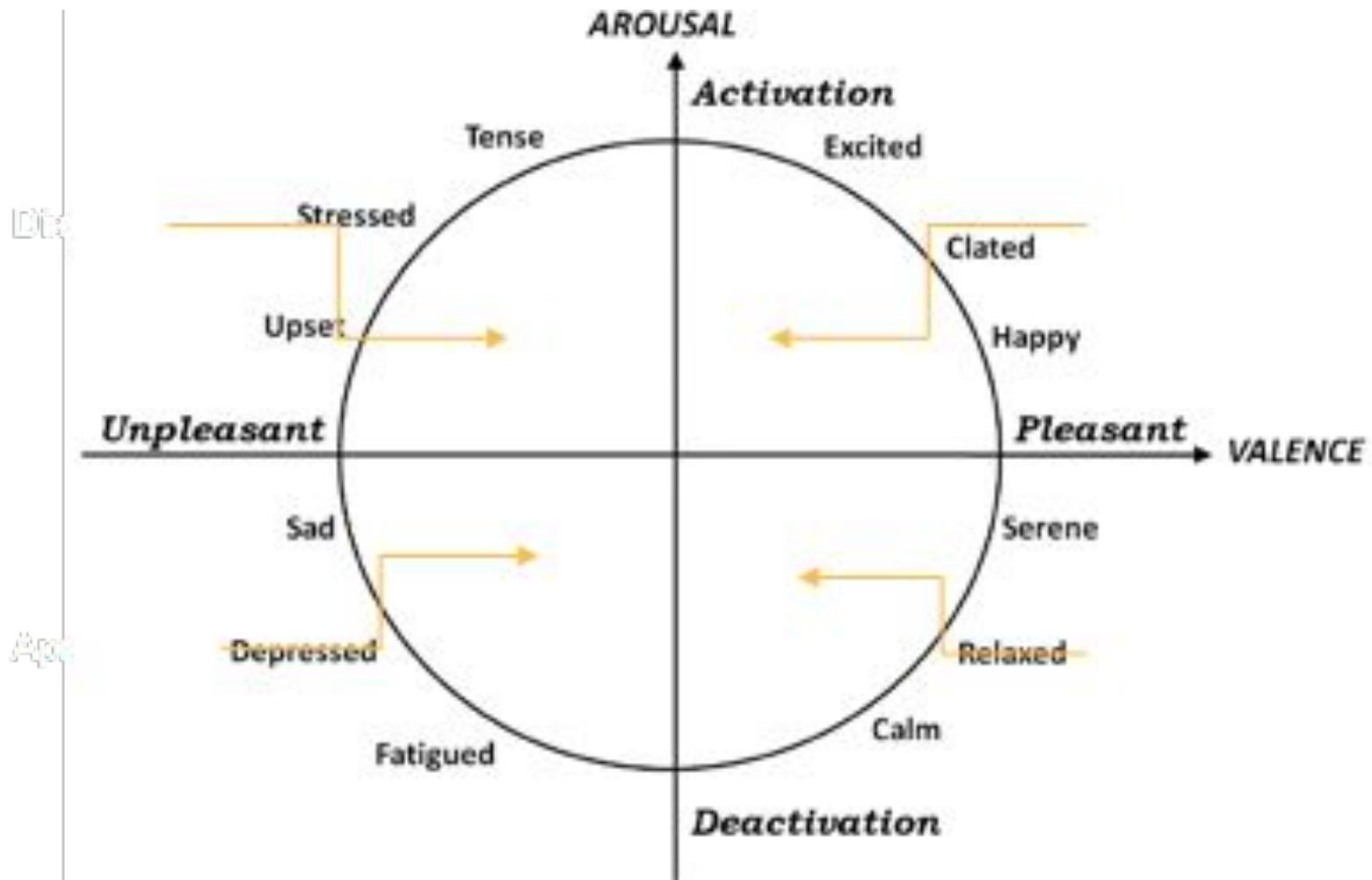
in partnership  
with

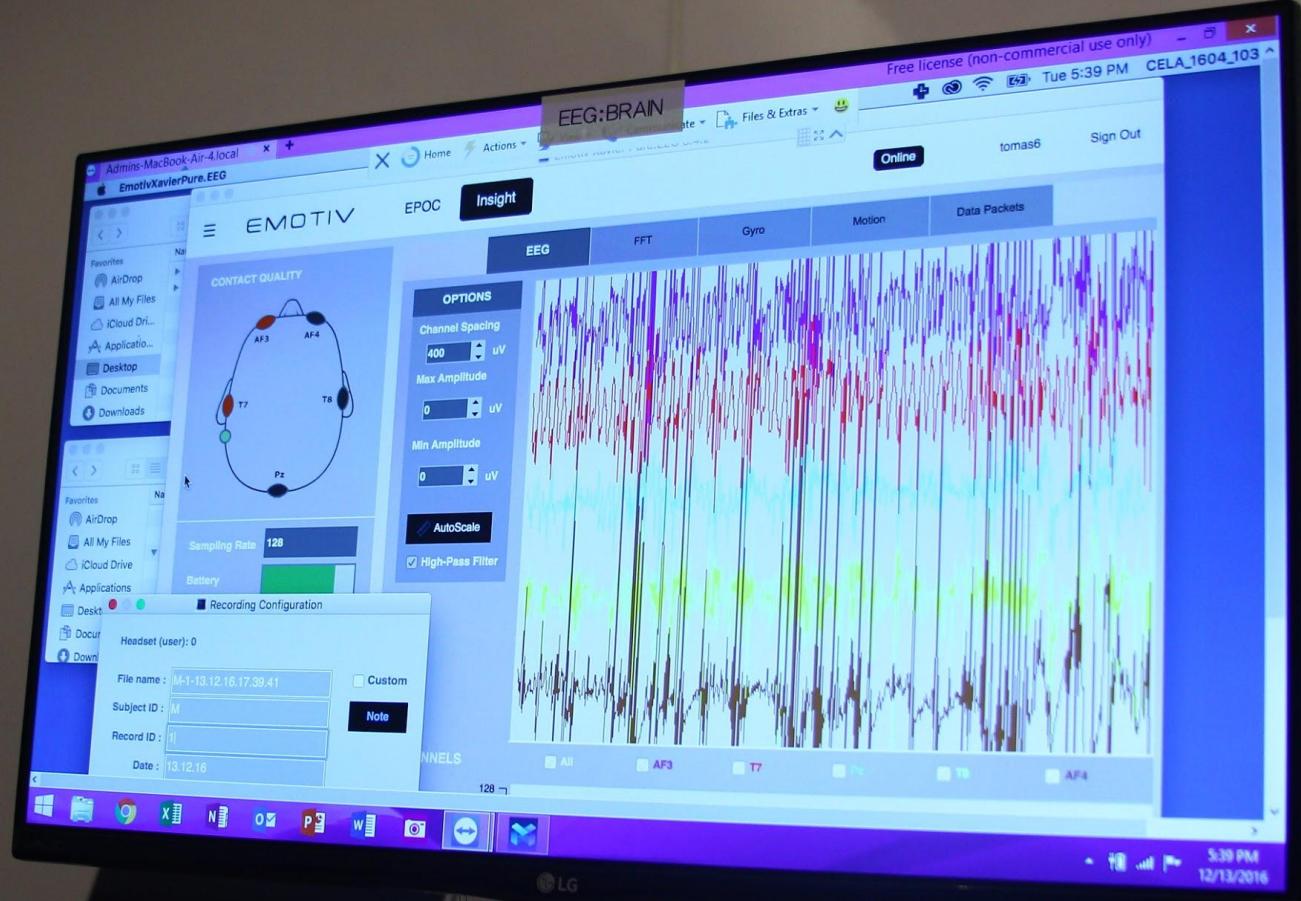


**N U W O R K S**  
**I N T E R A C T I V E**











### Big findings

DC - whole code  
SE - public interface  
TD - private design

Are all the way  
to be exposed (in certain cases)

### GOF findings

Sp - speed  
Dr - dropped  
St - sturdy

5 - it's great  
3 - it's unstoppable

P1 DC ATW TDS @ DASH ⚡ ND.GSR

P2 DC ATW RNR & RSR  
PLAN ND.GSR

ND.GSR

P3 DC ATW RREL @ T-SR only early GSR

\* PD KE correct

P4 PD AE @scd RREL @ T-SR already GSR ND.GSR

\* DC

P5 PTD.METHOD  
ME DC ADG first  
unstoppable

ADG

ADG  
advice  
clear  
GSR.PTDR.GSR  
PDA.GSR.GSR v3

### ZGIRLS

P6 DC.GSR.RNR.BR.GSR  
DC.METHOD.PRS  
BUND.NORME.SECURE  
VALUING.GSR.v3

P7 DC.GSR.RNR.BR.GSR  
BUND.NORME.SECURE  
VALUING.GSR.v3

P8 DC.GSR.RNR.BR.GSR  
BUND.NORME.SECURE  
VALUING.GSR.v3

P9 DC ATW DC.GSR  
offlineайнлайн  
NOV  
P10 DC.GSR.RNR.BR.GSR  
BUND.NORME.SECURE  
VALUING.GSR.v3

P11 DC ATW RNR.BR.GSR  
BUND.NORME.SECURE  
VALUING.GSR.v3

P12 DC ATW RNR.BR.GSR  
BUND.NORME.SECURE  
VALUING.GSR.v3

P13 DC ATW RNR.BR.GSR  
BUND.NORME.SECURE  
VALUING.GSR.v3

## 26 GIRLS

P6 DC@COOL Rcong @2:38  
DC:ATW@V2 FDIS  
valence increase @ "dandruff"  
valence drop @V2 (5s)

P7 DC@V1 ATW RNEV  
@negative valence  
@parts not liked  
AXEV  
CSR  
glutamin  
attract dirt V3  
unstopable V3  
motorcycle V3

P9 DC@TW  
definite relieved @ clean  
DC@V2  
PD@dirt V3

PD DC@ATW V1  
almost flat/jagged  
AF

↑↑ DC ATW@V2  
+spiking segment HHR NHR  
PE@V8 +char hysteron  
predict what  
to do with dirt @V2

PE@V8 ACN



# Sample scene analysis: Bike scene

Avg. Valence: 1.024 (high)

Avg. arousal: 0.512 (high)

Affect: Possible  
Excitement

Pocket recommendation:  
**keep**

Notes: confirms interest  
for bicycles

EEG values display 30%  
spike of values on arousal  
for the next 3 seconds  
from this scene



# Sample scene analysis: Enrique dance

Avg valence: 1.01 (high)

Avg arousal: 0.481 (low)

Affect: Definite Calm

Pocket recommendation:  
**don't**

Notes: EEG values 2 seconds before and 2 seconds after hardly changed (also for most selected scenes from 15s videos)



SRC TC: 02:01:18:08

A002C001\_161202\_R212.mov

# Sample scene analysis: scalp scene

Avg. Valence: 0.998 (low)

Avg. Arousal: 0.5101  
(high)

Affect: Probable Disgust

Pocket recommendation:  
**keep**

Notes:

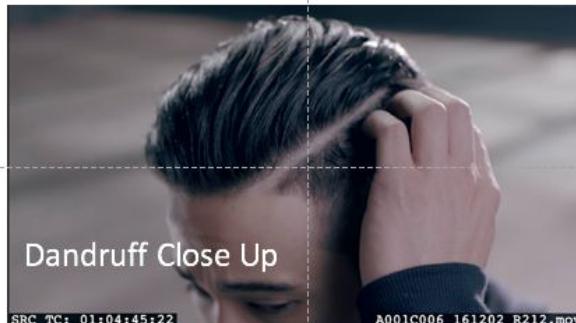
Some participants  
remembered dandruff on  
this scene even there was  
none as this was offline.



SRC TC: 01:04:46:11

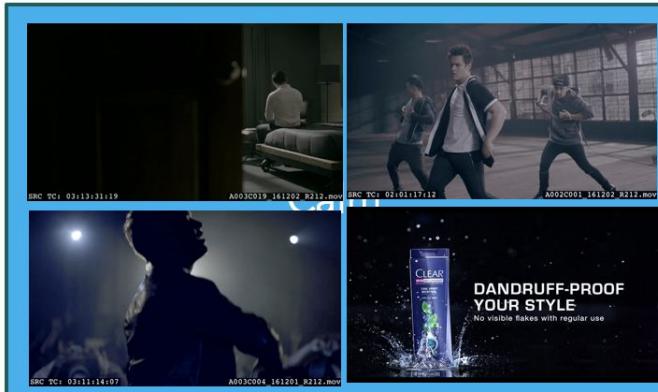
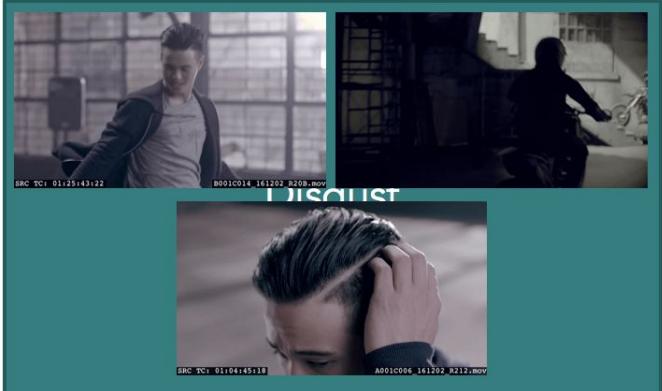
A001C006\_161202\_R212.mov

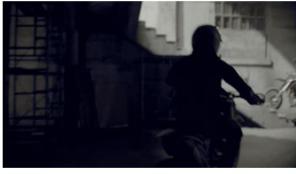
Bedroom



# Arousal

Valence





In collaboration with NuWorks Interactive Labs



**UNSTOPPABLE**  
**DANDRUFF-FREE FRESHNESS**

no visible flakes with regular use



The Future

HO VIVERE SENZA MIGLI Regular use  
COSMETIC





# TREX: Toolbox for Regression Experiments (sandbox) for machine learning

# Current Machine Learning Suites



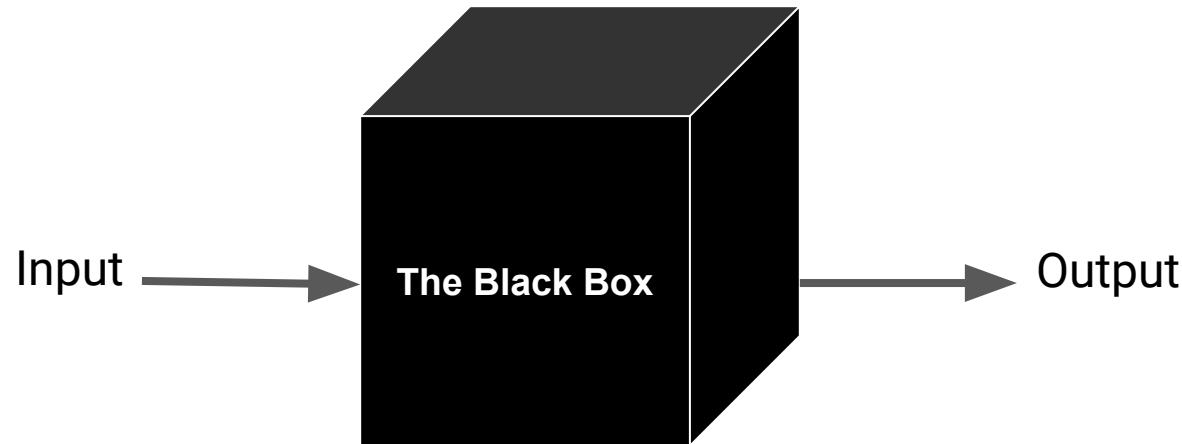
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Tools	Description	Interactive Visualizations?	Abstracts Algorithm Code?	User Feedback?
RapidMiner	Set of tools used to build ML systems from scratch.			Limited
Weka 3	Java integrated ML algorithms for data mining tasks.			Limited
Tensorflow Playground	Helps visualize the process of building Neural Networks.			Limited
Scikit Learn	Open source ML tools for Python.			N/A



# The “Black Box” Effect



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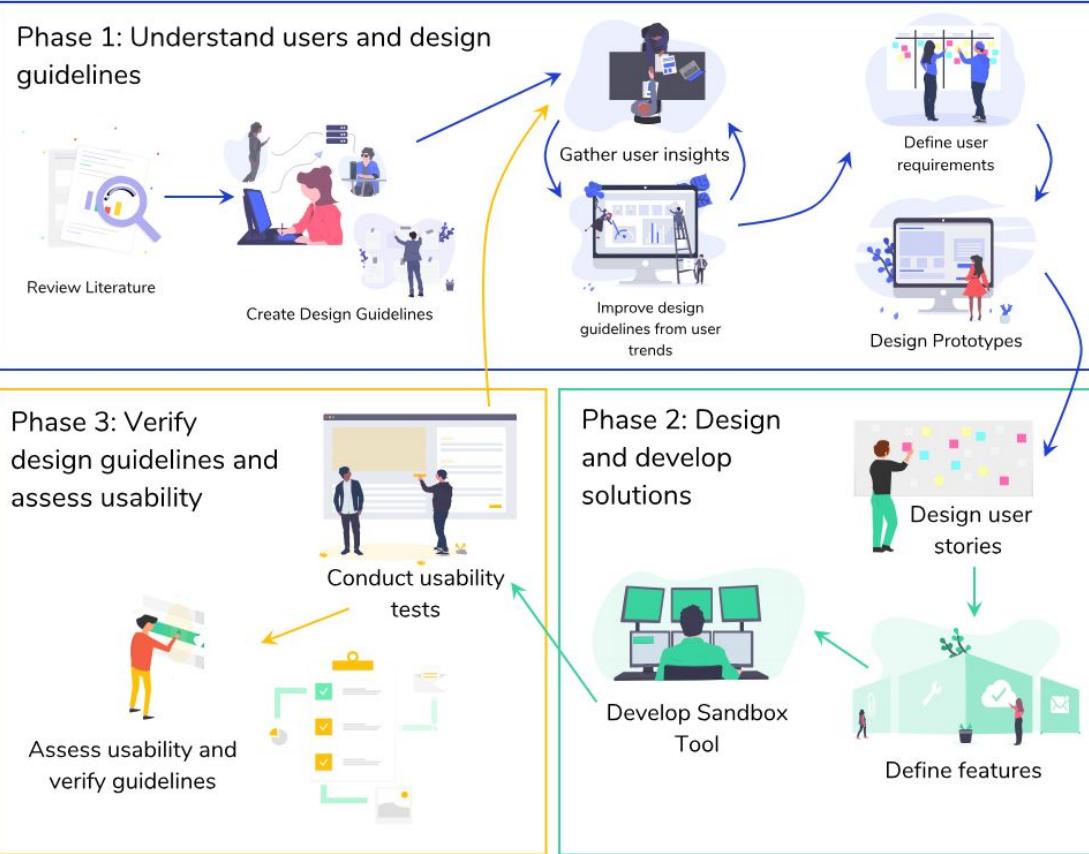
Teng Lee, James Johnson, and Steve Cheng. 2016. An Interactive Machine Learning Framework

# How might we use a sandbox approach to design an interactive machine learning system?



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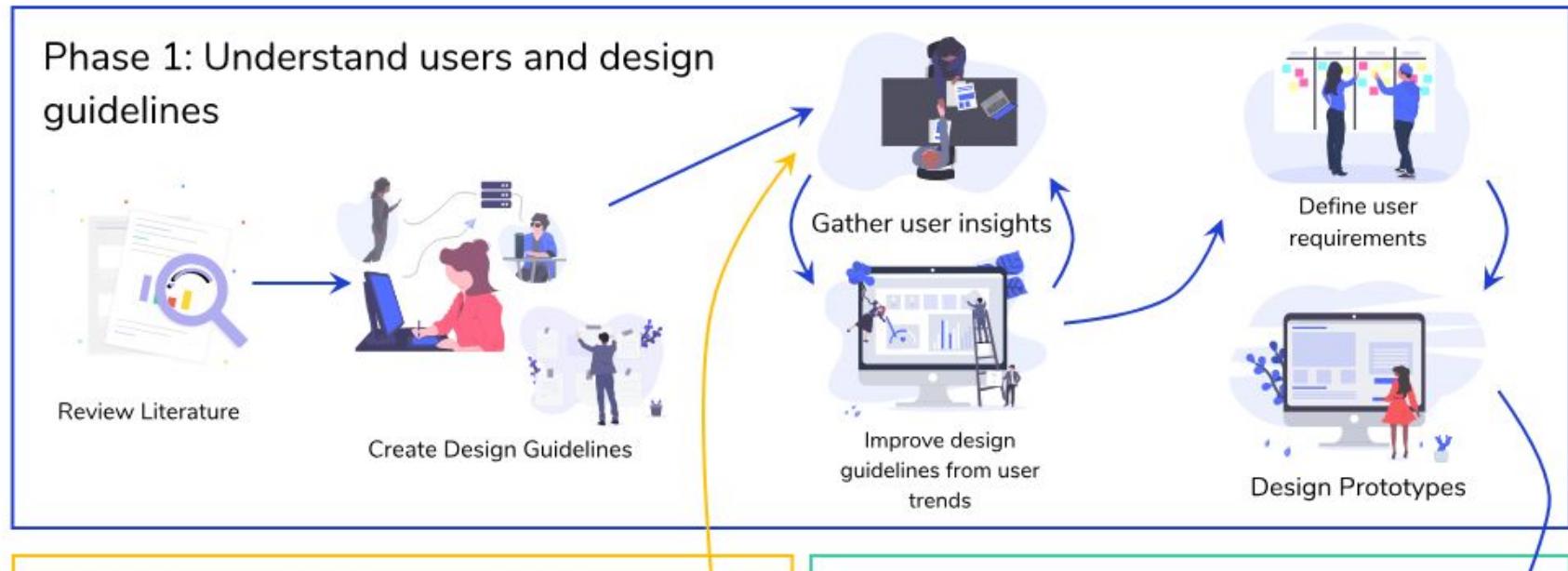
# Research Methodology



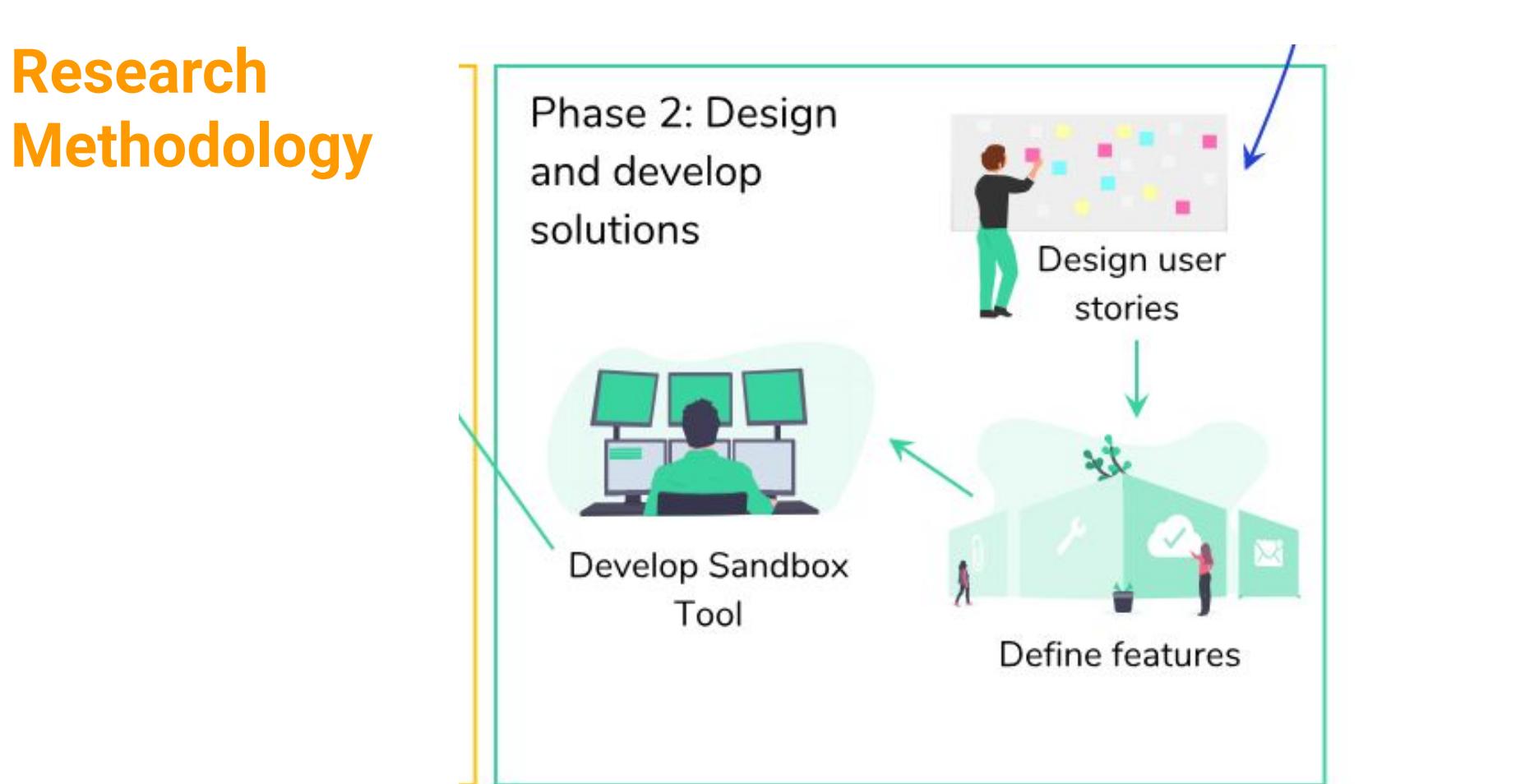
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# Research Methodology

## Phase 1: Understand users and design guidelines



# Research Methodology



# Research Methodology

Phase 3: Verify design guidelines and assess usability



Assess usability and verify guidelines



Conduct usability tests



# Phase 1 User Study Participants



Age Group: 19 - 25 Years Old



10 people (Snowball Sampling)



Expertise level:

1 - 4 Years Programming Experience

0 - 4 Year Machine Learning Experience



User Interviews



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# Study Design and Protocol

- Participants were contacted all in one week
- Interview times were specified by the participants availability
- Informed consent administered before interview
- Interview proceeds with consent to be recorded
- User insights were noted during the interview and verified with the recording
- Initial Design Guidelines were verified by the participants



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# Results



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# Results: General User Insights

- **Studying machine learning concepts was interesting in application based on their experience with ML tools.**
- Novice participants stated that they **struggle with mathematical theories and concepts** from their ML classes.
- Expert Participants stated that **it is up to the learner to seek a deeper understanding** in ML



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# Results: User Insights Per Tool

## RapidMiner

Visual interface that shows ML process

Elicited frustration due to restrictions with certain datasets

Confusing technical terms in functions and error messages

Lack of feedback

## WEKA

Visual interface

Complicated visualization

Data incompatibility errors that limit usable datasets

Confusing technical terms

Lack of feedback

## Scikit-learn

Flexible functions

Lacks visualization

Reliance on documentation for process understanding



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# Initial Design Guidelines

	1 Strongly Disagree	2	3	4 Strongly Agree
1. The system should indicate to user its state of change with every interaction.	0%	0%	10%	90%
2. The components of the interface should be laid out in an organized manner and explicitly labelled.	0%	0%	10%	90%
3. The visualizations should be simple enough to understand. They should not overload the user.	0%	0%	70%	30%
4. The intent of the system should be clear to the user upon interacting with the system.	0%	0%	10%	90%
5. Indicate explicitly when and why errors occur and how users can recover from them.	0%	10%	30%	60%



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# Conclusion

- We **created design guidelines** for an Interactive Machine Learning Sandbox Application based on related works
- We **conducted a user study** on the current problems that novice and expert users of ML face when starting out in ML
- We **gathered insights** about common ML suites
- We **validated and improved the guidelines** from the user insights



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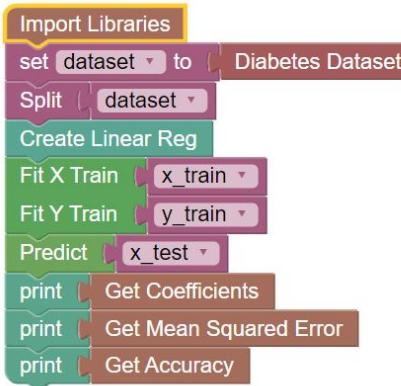
# Future Work

- Designing and developing the sandbox system for testing and experimentation.
  - Tool for Regression Experiments (TREX)
  - Creates basic prediction models using online sample datasets.
  - Translates code blocks into actual Python (3.0) code and produces the respective output.
- Conducting usability testing to verify the design guidelines proposed.



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Run CodeBlocks

```
dataset = None
x_train = None
y_train = None
x_test = None
```

```
import numpy as np
from sklearn import datasets, linear_model
from sklearn.metrics import mean_squared_error, r2_score
dataset = datasets.load_diabetes()
d = dataset
x = d.data[:, np.newaxis, 2]
```

```
// Your output is displayed here.
Coefficients: 938.237861251263
Mean Squared Error: 2548.0723987259703
Accuracy: 0.47257544798227136
```



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TREX Prototype v2



# UX&AI

**Some final takeaways  
from this presentation**

# UX&AI

first take away

Humans come  
first when  
designing AI  
products

# UX&AI

second take away

Products are  
usable not if  
we change the  
interface but if  
we improve  
the experience  
it offers

# UX&AI

third take away

Applying UX in  
AI goes a long  
way in making  
a product  
usable and  
sustainable.



Planes **dont** flap their wings to fly, but  
birds **dont** take off from trees either...

A car can **run faster** than a  
cheetah but it can **never climb**  
a tree..



# UX & AI

How we used UX to improve AI:  
Case studies where UX played a  
role in the design of better AI

Talk to me!

@jrdndj

jordan.deja@dlsu.edu.ph