

How Important is Data Quality for Data Engineer?

(づ。・_・。)づ



@manelbutterfly

Who Am I ?

- ❖ Data Engineer at Secret Sauce Partners Inc.
- ❖ Mozilla Representative
- ❖ Enthusiast about new Data technologies

“The only way to do great work is to love the work you do”
Steve Jobs



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What We Do?



Transforming apparel & footwear shopping through data.

DXL
MENS APPAREL



Google
shopping



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NORDSTROM
rack | HAUTELOOK

What We Do?



Company's service



What We Do?

FREE SHIPPING OVER \$50
+ FREE RETURNS ON ALL ORDERS!

50 MANY NEW MARKDOWNS!
SHOP THE SALE >

Lulus

NEW BESTSELLERS DRESSES SHOES CLOTHING ACCESSORIES SALE #LOVELULUS

Looking for something special? SIGN IN

LIMITED TIME ONLY 50% OFF OVER 400 STYLES! SHOP THE SALE >

SHIFT AND SHOUT NAVY BLUE SHIFT DRESS

LULUS

\$48

★★★★★ (505)

style 274532

Navy Blue

FIT PREDICTOR Calculate your size

XS

S

M

L

XL

SIZE CHART

RETURN POLICY

ADD TO BAG

+ WISHLIST

DESCRIPTION

SIZE & FIT

MODEL INFO

Lulus Exclusive! Shimmey, shuffle, and shake in the Shift and Shout Navy Blue Shift Dress, because you know you look so good! Women's poly fabric shapes a rounded neckline atop a darted bodice with short sleeves. The shift silhouette falls into a flirty, leg-baring length. Exposed gold back zipper.

- Dress is lined; sleeves are not.
- 100% Polyester.
- Hand Wash Cold.
- Made with Love in the U.S.A.

COMPLETE THE LOOK

#LOVELULUS Tag your photos on Instagram for a chance to WIN \$200!

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5



What We Do?

Lulus

HOW BESTSELLERS DRESSES SHOES CLOTHING ACCESSORIES SALE #LOVELULUS

Looking for something special? SIGN IN

LIMITED TIME ONLY 50% OFF OVER 400 STYLES! SHOP THE SALE >



SHIFT AND SHOUT NAVY BLUE SHIFT DRESS

LULUS \$48

★★★★★ (565)

style 274832

My dress size is

Select a similar designer that fits you

Select your size

1 / 2

NAVY BLUE

FIT PREDICTOR Calculate your size

XS S M L XL

[SIZE CHART](#) | [RETURN POLICY](#)


ADD TO BAG **+ WISHLIST**

DESCRIPTION **SIZE & FIT** **MODEL INFO**

Lulus Exclusive! Shimmy, shuffe, and shake in the Shift and Shout Navy Blue Shift Dress, because you know you look so good! Woven poly fabric shapes a rounded neckline atop a dented bodice with short sleeves. The shift silhouette falls into a flirty, leg-baring length. Exposed gold back zipper.

- Dress is lined; sleeves are not
- 100% Polyester
- Hand Wash Cold
- Made with Love in the U.S.A.

COMPLETE THE LOOK



#LOVELULUS Tag your photos on Instagram for a chance to WIN \$200!

What We Do?

The screenshot displays the Lulus website interface. At the top, a navigation bar includes the Lulus logo, menu categories (NEW, BESTSELLERS, DRESSES, SHOES, CLOTHING, ACCESSORIES, SALE, LOVE LULUS), a search bar with the placeholder text "Looking for something special?", and a "SIGN IN" link. A promotional banner below the navigation bar states "LIMITED TIME ONLY 50% OFF OVER 400 STYLES! SHOP THE SALE >".

The main content area features a product page for the "SHIFT AND SHOUT NAVY BLUE SHIFT DRESS" (style 274532). The product is priced at \$48 and has a 5-star rating from 585 reviews. A color selection row shows various options, with "Navy Blue" selected. A "FIT PREDICTOR" overlay is active, prompting the user to "calculate your size" and "Select a similar designer that fits you". The dropdown menu lists designers: Adidas, DCDGMAXAZRIA, Betsey Johnson, Boden, breckelle's, For Love & Lemons, Free People, French Connection, Jole, Lovers + Friends, Lucky Brand, Lush, Nike, Rebecca Taylor, Rvco, solemio, Topshop, Tory Burch, and Wildfox.

Below the size selection, there are links for "FIT SIZE CHART" and "RETURN POLICY". The product page includes an "ADD TO BAG" button and a "+ WISHLIST" button. The "DESCRIPTION" tab is selected, showing details about the dress's features: "Lulus Exclusive! Shiny, shuffe, and shake in the Shift and Shout Navy Blue Shift Dress, because you know you look so good! Woven only fabric shapes a rounded neckline with a cinched bodice with short sleeves. The shift silhouette falls into a flirty, leg-baring length. Exposed gold back zipper." Additional details include: "Dress is lined; sleeves are not.", "100% Polyester", "Hand Wash Cold", and "Made with Love in the U.S.A.". A "COMPLETE THE LOOK" section at the bottom shows a gold necklace and earrings.

At the bottom of the page, a social media promotion reads "#LOVELULUS Tag your photos on Instagram for a chance to WIN \$2000".

What We Do?

Lulus

NEW BESTSELLERS EDITORS' CHOICE SHIRTS DRESSES ACCESSORIES BAGS FAVORITE LULUS

Looking for something special?

JOIN US

LIMITED TIME ONLY 50% OFF OVER 400 STYLES! SHOP THE SALE >

SHIFT AND SHOUT NAVY BLUE SHIFT DRESS

Lulus \$48

★★★★★ (585)

style 274532

My dress size is

Rebecca Taylor

Select your size

Select your size

XS S M L XL O 2 4 6 8 10 12 14

ADD TO BAG + WISHLIST

DESCRIPTION SIZE & FIT MODEL INFO

Lulus Exclusive! Shimmy, shuffle, and shake in the Shift and Shout Navy Blue Shift Dress, because you know you look so good! Waves party fabric hugs a round neckline with a cinched bodice with short sleeves. The shift silhouette falls into a flirty, leg-baring length. Exposed gold back zipper.

- Dress is lined; sleeves are not.
- 100% Polyester.
- Hand Wash Cold.
- Made with Love in the USA.

COMPLETE THE LOOK

#LOVELULUS Tag your photos on Instagram for a chance to WIN \$200!

What We Do?

Lulus NOW BESTSELLERS DRESSES SHOES CLOTHING ACCESSORIES SALE #LOVELULUS

Looking for something special? SIGN IN

LIMITED TIME ONLY 50% OFF OVER 400 STYLES! SHOP THE SALE >

SHIFT AND SHOUT NAVY BLUE SHIFT DRESS

LULUS \$48 (99%)

style 274532

FIT PREDICTOR calculate your size

Based on your past purchases, in this item we think you are size

S

XS S M L XL

SIZE CHART RETURN POLICY

ADD TO BAG + WISHLIST

DESCRIPTION SIZE & FIT MODEL INFO

Lulus Exclusive! Shimmer, shuffle, and shake in the Shift and Shout Navy Blue Shift Dress, because you know you look so good! Woven poly fabric shapes a rounded neckline atop a darted bodice with short sleeves. The shift of the skirt falls into a flirty, leg-baring length. Exposed gold back zipper.

- Dress is lined; sleeves are not.
- 100% Polyester.
- Hand Wash Cold.
- Made with Love in the U.S.A.

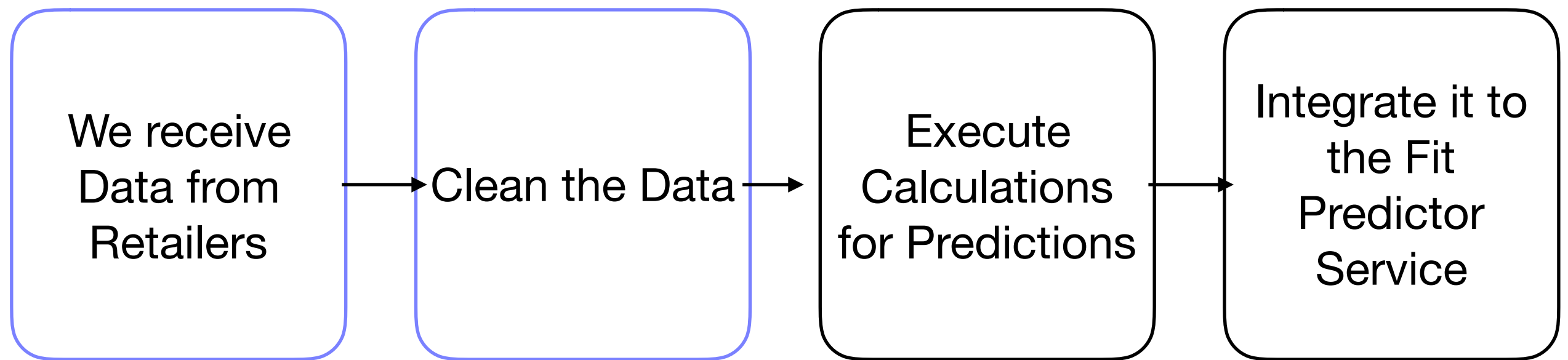
COMPLETE THE LOOK

#LOVELULUS Tag your photos on Instagram for a chance to WIN \$2000!



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What We Do?



What We Do?

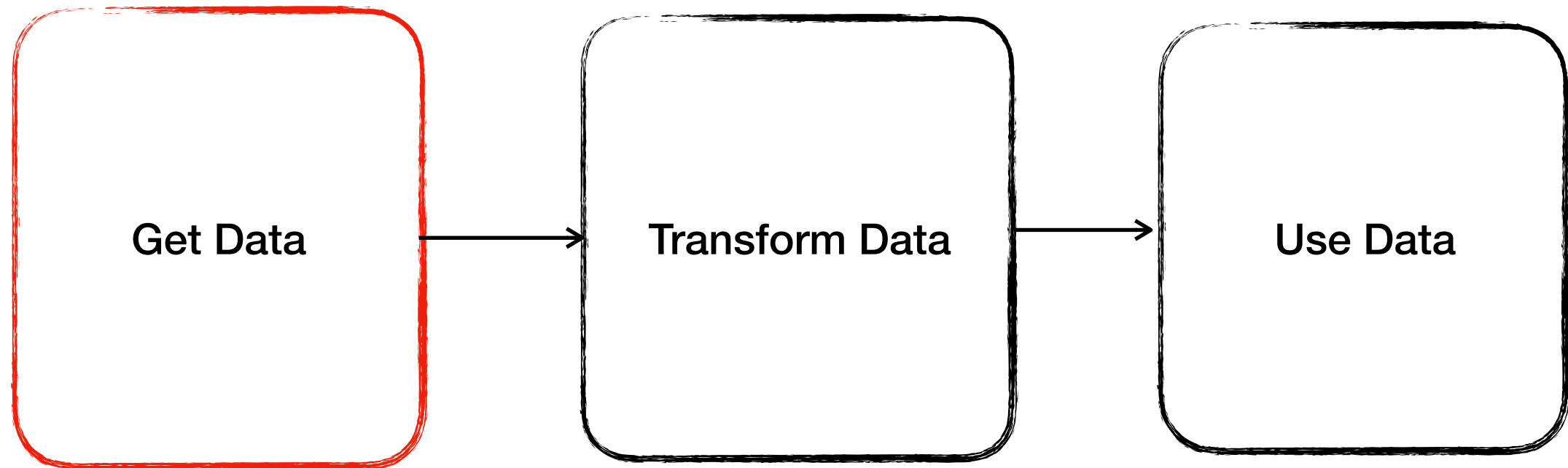
Product's Specification Requirements

	Required?
variant_id	✓
color	✓
material	⚠
pattern	⚠
size	✓
size_system	✓
size_type	✓
product_id	✓
name	✓
description	⚠
gender	✓
age_group	✓
brand	✓
product_category	✓
google_product_category	⚠
condition	⚠
link	✓
mobile_link	⚠
image_link	✓
additional_image_link	⚠
availability	✓
availability_date	⚠
price	✓
sale_price	⚠
return_days	⚠
gtin	⚠
mpn	⚠

Transaction's Specification Requirements

	Required?
transaction_item_id	✓
customer_id	✓
customer_email_hash	✓
customer_gender	⚠
transaction_type	✓
transaction_date	✓
transaction_id	✓
variant_id	✓
price	✓
quantity	✓
return_reason	⚠
final_sale	⚠
gift	⚠
store_id	⚠

Where is Data Quality?



Where is Data Quality?



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$$\backslash = (\cdot \cdot)$$


How Should I qualify this Data? $C \cdot D _ C \cdot D$



But How I can ensure
all of this?

—_ (ツ) _ /—



Profiling 🤝.ಽಠಠಠಽ.🤝

- ◆ Anomalies ?
- ◆ Content? Structure? Relation?
- ◆ Can this apply to our Business Logic?
- ◆ Missing values ?
- ◆ Distribution of required information



Profiling 🙌.ಠ_ಠ?.🙌

Spark profiling module

Simple query

Simple Statistics



Profiling 🙌.ಠ_ಠ?.🙌

```
1 variants = spark.read.csv("DXLFeed_20160122.txt", header=True, inferSchema=True, sep="|")
2 variants.registerTempTable("variants")
3 display(variants)
```

- ▶ (3) Spark Jobs

```
▶ variants: pyspark.sql.dataframe.DataFrame = [shortDescription: string, longDescription: string ... 53 more fields]
```

itmName	brandName	keywords	absoluteURL	imageURL	classCode	categoryCode	itemNumber	parentCategory	daysAvailable	newArrival	product_type	sku
ories	Rochester	19300 hankies WEBSORT2 handkerchiefs handkerchiefs	http://www.destinationxl.com/mens-big-and-tall-store/mens-shirt-accessories/rochester-large-handkerchiefs/cat140012/19300	http://images.destinationxl.com/is/image/CasualMale/p19300?\$product\$	541	R	19300	cat140012	2578	false	Clothing > Suits & Sport Coats > Shirt/Tie/Lapel Accessories,Clothing > Dresswear > Shirt/Tie/Lapel Accessories,Clothing > Accessories > Shirt/Tie/Lapel Accessories,Brands > Rochester	19300 WHI
ories	null	24086 collar stays brass WEBSORT2	http://www.destinationxl.com/mens-big-and-tall-store/mens-shirt-accessories/brass-collar-stays-cat140012/24086	http://images.destinationxl.com/is/image/CasualMale/p24086?\$product\$	544	R	24086	cat140012	2578	false	Clothing > Suits & Sport Coats > Shirt/Tie/Lapel Accessories,Clothing > Dresswear > Shirt/Tie/Lapel	24086 BRV

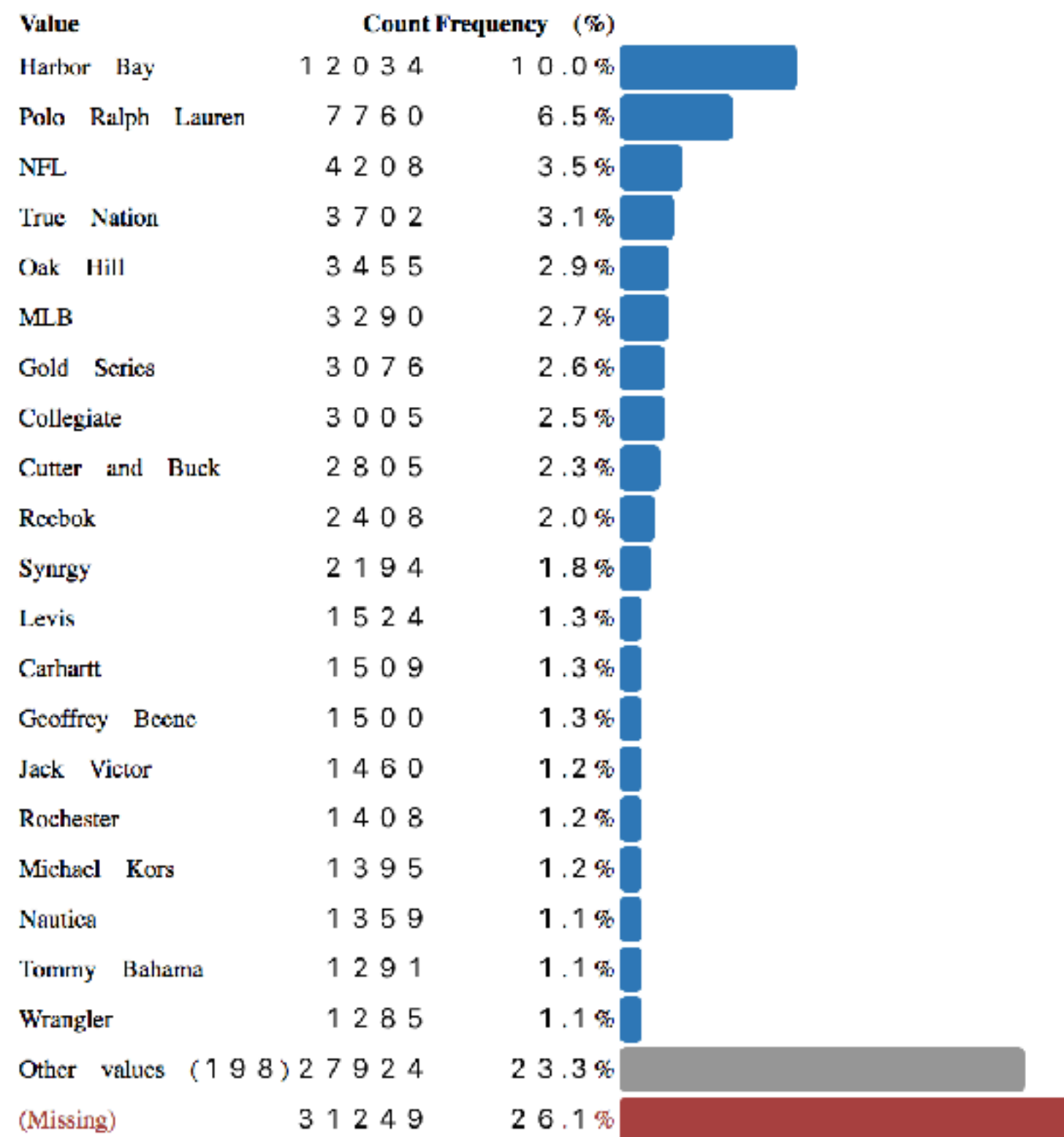
Showing the first 520 rows.

Command took 8.29 seconds -- by marel@secretsaucepartners.com at 1/24/2018, 8:59:14 AM on Development Cluster



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Toggle details



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Value	Count	Frequency (%)	
Custom Dress Shirts	21420	17.9%	
Button Down	7928	6.6%	
Casual Pants	6804	5.7%	
Polos	6151	5.1%	
NFL	4405	3.7%	
MLB	4337	3.6%	
Collegiate	4061	3.4%	
Tees	3986	3.3%	
Shorts	3139	2.6%	
Suit Separates	2703	2.3%	
Sport Coats & Blazers	2652	2.2%	
Dress Shirts	2496	2.1%	
Dress Pants	2413	2.0%	
Relaxed Fit	2213	1.8%	
Mix & Match Geoffrey Beene, Gold Series & Synrgy Dress Shirts	1967	1.6%	
True Nation	1674	1.4%	
Nautica	1525	1.3%	
Sweaters & Vests	1396	1.2%	
Long Sleeve Knits	1336	1.1%	
Ties & Pocket Squares	1204	1.0%	
Other values (134)	30148	25.2%	
(Missing)	5883	4.9%	



edp

Numeric

Distinct	count	1	1	9	8	4	1
Unique	(%)	1	0	0	.0	%	
Missing	(%)	0	.0	%			
Missing	(n)	0					
Infinite	(%)	0	.0	%			
Infinite	(n)	0					
Mean		1	1	3	3	9	0
Minimum		1	0	8			
Maximum		1	3	7	9	0	0
Zeros	(%)	0	.0	%			



Toggle details

Quantile statistics

Minimum	1	0	8				
5 -th percentile	4	1	3	5	4	0	
Q 1	1	0	9	8	3	0	0
Median	1	2	4	6	2	0	0
Q 3	1	3	1	6	1	0	0
9 5 -th percentile	1	3	6	0	3	0	0
Maximum	1	3	7	9	0	0	0
Range	1	3	7	8	9	0	0
Interquartile range	2	1	7	7	8	0	



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Value	Count	Frequency (%)	
null	6 7 9 7 0	5 6 .7 %	
2 XL	5 8 8 8	4 .9 %	
4 XL	5 4 6 1	4 .6 %	
3 XL	5 4 4 1	4 .5 %	
2 XLT	5 2 1 8	4 .4 %	
3 XLT	4 9 2 2	4 .1 %	
5 XL	4 8 9 3	4 .1 %	
4 XLT	4 5 1 7	3 .8 %	
1 XLT	3 4 0 4	2 .8 %	
1 XL	3 3 0 6	2 .8 %	
6 XL	3 1 4 8	2 .6 %	
5 XLT	1 7 5 3	1 .5 %	
XLT	1 0 6 8	0 .9 %	
7 XL	6 4 8	0 .5 %	
6 XLT	5 3 3	0 .4 %	
8 XL	3 1 9	0 .3 %	
7 XLT	2 5 0	0 .2 %	
LT	1 5 7	0 .1 %	
XL	1 3 0	0 .1 %	
1 3 - 1 6	9 9	0 .1 %	
Other values (3 5)	7 1 6	0 .6 %	



shortLength
Categorical

Distinct	count	7
Unique	(%)	0.0 %
Missing	(%)	0.0 %
Missing	(n)	0
Infinite	(%)	0.0 %
Infinite	(n)	0

	null	1 1 7 7 5 5
	Reg	1 1 4 2
	Long	4 0 1
Other values	(4)	5 4 3

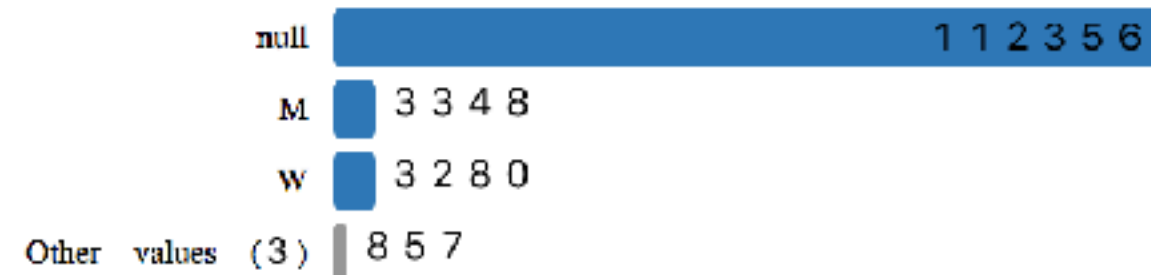
Toggle details

Value	Count	Frequency (%)
null	1 1 7 7 5 5	98.3 %
Reg	1 1 4 2	1.0 %
Long	4 0 1	0.3 %
LONG	2 5 3	0.2 %
BIG	1 3 3	0.1 %
TALL	1 0 7	0.1 %
SHORT	5 0	0.0 %

shoeWidth

Categorical

Distinct	count	6
Unique	(%)	0.0 %
Missing	(%)	0.0 %
Missing	(n)	0
Infinite	(%)	0.0 %
Infinite	(n)	0



Toggle details

Value	Count	Frequency (%)
null	112356	93.8 %
M	3348	2.8 %
W	3280	2.7 %
EW	795	0.7 %
EEW	61	0.1 %
N	1	0.0 %

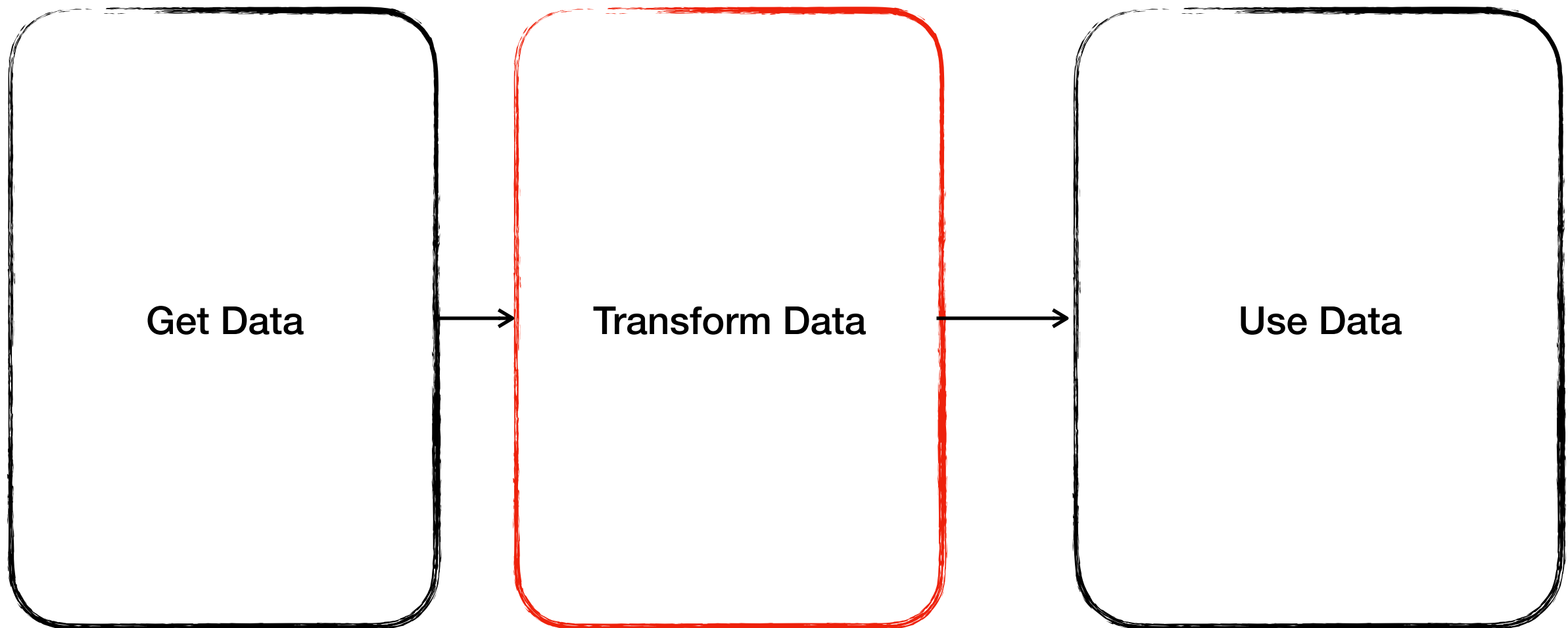
Toggle details

Value	Count	Frequency (%)
null	1 1 2 3 3 0	9 3.7 %
1 2	1 5 0 3	1.3 %
1 3	1 4 4 6	1.2 %
1 4	1 3 4 6	1.1 %
1 5	1 1 8 2	1.0 %
1 1	7 7 5	0.6 %
1 0	5 5 6	0.5 %
1 6	5 0 1	0.4 %
1 7	8 8	0.1 %
1 8	4 4	0.0 %
1 5 / 1 6	1 6	0.0 %
1 1 / 1 2	1 6	0.0 %
1 3 / 1 4	1 3	0.0 %
9 / 1 0	8	0.0 %
1 1.5	5	0.0 %
1 4 / 1 5	5	0.0 %
1 2 / 1 3	4	0.0 %
1 0.5	3	0.0 %



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What We Do?



Testing Rules १✌️°◡°✌️4

Write Ingestion

Write UDF functions

Test them



Testing Rules ٩٠٠٠٩

```
@staticmethod
def size_type(size=None, shoe_size=None, shoe_width=None, category=None):
    shoes_categories = ['Running', 'Shoes', 'Sneakers', 'Dress Boots', 'Flip Flops']
    if shoe_size:
        return {
            'N': 'narrow',
            'W': 'wide',
            'EW': 'wide',
            'EEW': 'wide',
        }.get(shoe_width, 'regular')
    if category and (any([shoe_category in category for shoe_category in shoes_categories])):
        return 'regular'
    if size:
        if size.endswith('LT'):
            return 'tall'
    return 'big'
```



Testing Rules ?✌️°~°✌️4

```
def test_destinationxl_size_type():  
    assert TransformProducts.size_type(category='Formalwear') == 'big'  
    assert TransformProducts.size_type(category='Dress Shirts') == 'big'  
    assert TransformProducts.size_type(category='Flip Flops') == 'regular'  
    assert TransformProducts.size_type(category='Dress Boots') == 'regular'  
    assert TransformProducts.size_type('3XL') == 'big'  
    assert TransformProducts.size_type('XL') == 'big'  
    assert TransformProducts.size_type('42') == 'big'  
    assert TransformProducts.size_type(shoe_size='10', shoe_width='W') == 'wide'  
    assert TransformProducts.size_type(shoe_size='10', shoe_width='W') != 'regular'  
    assert TransformProducts.size_type(shoe_size='10', shoe_width='W') == 'wide'  
    assert TransformProducts.size_type(shoe_size='12', shoe_width='M') == 'regular'  
    assert TransformProducts.size_type(shoe_size='13', shoe_width='EEW') == 'wide'  
    assert TransformProducts.size_type(shoe_size='11', shoe_width='EW') == 'wide'  
    assert TransformProducts.size_type('1XLT') == 'tall'  
    assert TransformProducts.size_type(size='1XLT') == 'tall'  
    assert TransformProducts.size_type('LT') == 'tall'  
    assert TransformProducts.size_type(category='Sneakers') == 'regular'
```

Testing Rules ?✌️°~°✌️4

```
@staticmethod
def size(size=None,
        sleeve_size=None,
        neck_size=None,
        waist_size=None,
        shoe_size=None,
        coat_size=None):
    if size:
        return size
    if neck_size:
        if sleeve_size:
            return '{0}x{1}'.format(neck_size, sleeve_size)
        return neck_size
    if waist_size:
        return waist_size
    if shoe_size:
        return shoe_size
    if coat_size:
        return coat_size
```

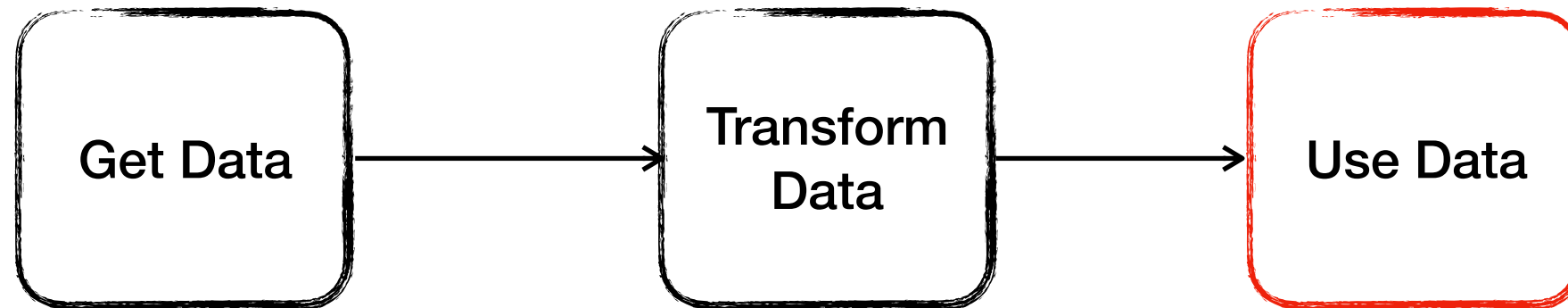


Testing Rules ?✌️°~°✌️4

```
def test_destinationxl_size():  
    assert TransformProducts.size(size='2XL') == '2XL'  
    assert TransformProducts.size(sleeve_size='36/37', neck_size='17') == '17x36/37'  
    assert TransformProducts.size(waist_size='36/37') == '36/37'  
    assert TransformProducts.size(shoe_size='10.5') == '10.5'  
    assert TransformProducts.size(coat_size='54') == '54'  
    assert TransformProducts.size(size='5XL') == '5XL'  
    assert TransformProducts.size(size='2XLT') == '2XLT'  
    assert TransformProducts.size(size='1XL') == '1XL'  
    assert TransformProducts.size(neck_size='16.5', sleeve_size='36/37') == '16.5x36/37'  
    assert TransformProducts.size(neck_size='18') == '18'  
    assert TransformProducts.size(waist_size='42') == '42'  
    assert TransformProducts.size(waist_size='40') == '40'  
    assert TransformProducts.size(shoe_size='13') == '13'  
    assert TransformProducts.size(coat_size='50') == '50'
```



What We Do?





"Maybe stories are just data with a soul."

-Brené Brown