

INSIGHTS REPORT



BIOTEXFUTURE⁷
TRANSITION LAB

CONSUMER INSIGHTS ON BIO-BASED PRODUCTS

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FAU x Symanto – 18.11.2022

1. KEY INSIGHTS
2. METHODOLOGY
3. RESULTS
4. DASHBOARD
5. OUTLOOK & IMPLICATIONS

The goal of this study was to **find out how people think and talk about bio-based (textile) products on social media**. By using Artificial Intelligence to analyze the data, **consumer motivations, important product attributes as well as consumer segments** could be identified.

An aerial photograph of a dense forest with various shades of green. The text "KEY INSIGHTS" is overlaid in the center in a bold, white, sans-serif font.

KEY INSIGHTS

AS PART OF TRANSITIONLAB 2, WE LOOKED INTO OVER 250.000 SOCIAL MEDIA POSTS TO ANALYZE WHAT PEOPLE SAY ABOUT BIO-BASED PRODUCTS

Key insights Research Symanto x FAU

- Sustainable Fashion accounts for almost 20% of all comments in the overall fashion industry. The number of comments on Sustainable Fashion trends **increased throughout the past 3 years**.
- Besides bio-based textiles (incl. vegan leather, algae fabrics, mushroom leather), the **main trends in Sustainable Fashion** are ethical fashion (also called “slow fashion”), natural & organic fabrics, recycled fashion and fair fashion.
- **Social media, incl. Twitter, Instagram and TikTok**, are driving the Sustainable Fashion trend. In particular, **TikTok** with a growing number of comments on ethical fashion in 2022.

AS PART OF TRANSITIONLAB 2, WE LOOKED INTO OVER 250.000 SOCIAL MEDIA POSTS TO ANALYZE WHAT PEOPLE SAY ABOUT BIO-BASED PRODUCTS

Key insights Research Symanto x FAU

- **Top brands** in Sustainable Fashion include Lucy & Yak, Everlane and Reformation. VEJA is the most discussed brand in bio-based textiles.
- **Quality** and **price** are the main product aspects discussed in connection with sustainable fashion. While quality is mainly mentioned positively in relation to bio-based textiles, price is the main source of complaints for all sustainable fashion products.
- Sustainable fashion is largely a **trend on social media**. Particularly, it relates to ethical fashion. However, the main motivation behind the conversations on bio-based textiles, is saving the environment.

An aerial photograph of a dense, lush green forest. The trees are packed closely together, creating a textured canopy of various shades of green. The word "METHODOLOGY" is superimposed in the center of the image in a large, bold, white, sans-serif font. The text is centered horizontally and vertically, standing out prominently against the dark green background of the forest.

METHODOLOGY

IN THE METHODOLOGY, THE DATA WAS FIRST COLLECTED, THEN ANALYZED USING AI, AND FINALLY COMPILED

Methodology

Data collection

- Publicly accessible data
- Wide range of social media & review sites
- Data cleaning process to eliminate “noise”

AI assisted analysis

- AI (Natural Language Processing) based text analytics modules to extract topics & sentiment at highly granular level
- Human assisted optimization of language model, if needed
- Advanced text analytics modules to extract metrics such as Brand Love, Brand Recommendation, etc.

Reporting

- Extract relevant, meaningful results

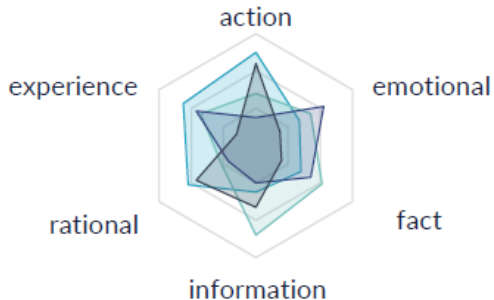
PSYCHOGRAPHICS USE VARIOUS CONVERSATIONS, CLUSTERS THEM, AND THEN ENRICHES THEM WITH THEMES AND INTERESTS

How psychographics work

Various conversations
around Brand & Competitors



Psychographic* clustering



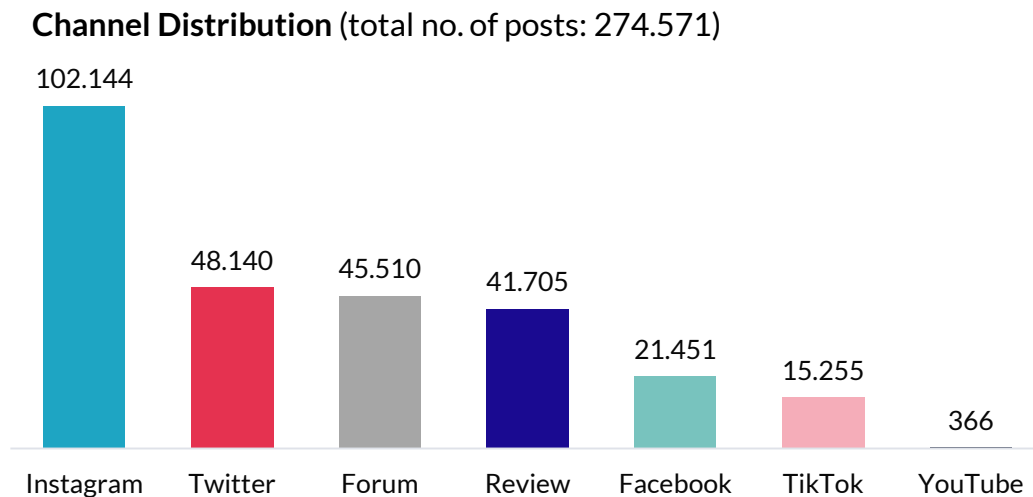
Enriching clusters with
topics and their interests

- What they talk about
- Sentiment
- Likes & Dislikes
- Emotions
- Other brands
- Preferred channels
- Etc.

*Based on Carl Gustav Jung Personality traits & Schulz von Thun communication theory

THE DATA WAS COLLECTED FROM REVIEWS, FORUMS, SOCIAL MEDIA OF LARGEST PRODUCERS FOCUSED ON BIO-BASED TEXTILES AND SUSTAINABLE FASHION

Data source & time span



Time span: January 2019 – June 2022

THE DATA WAS COLLECTED FROM REVIEWS, FORUMS, SOCIAL MEDIA OF LARGEST PRODUCERS FOCUSED ON BIO-BASED TEXTILES AND SUSTAINABLE FASHION

Data source & time span

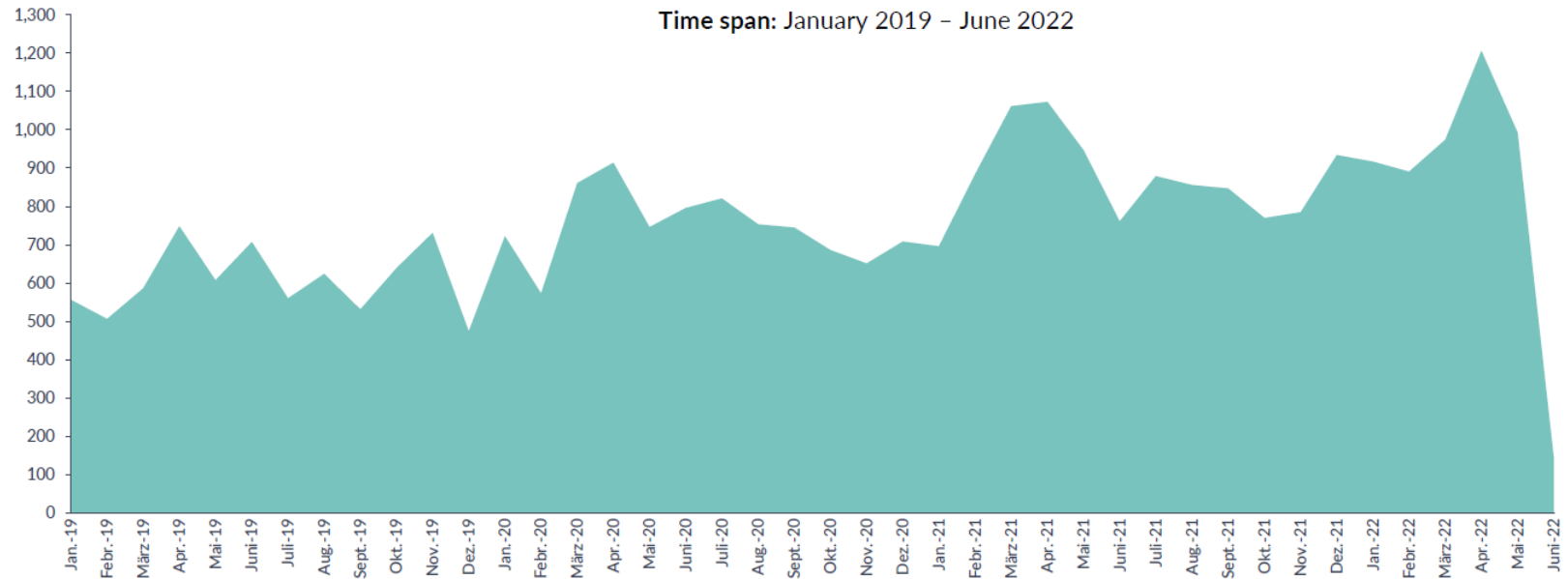
Data collected



THE AMOUNT OF COMMENTS ON SUSTAINABLE FASHION AND BIO TEXTILES INCREASED THROUGHOUT THE PAST THREE YEARS PERIOD

Time span & trend overview

Conversation volume on Sustainable Fashion, # of posts



An aerial photograph of a dense, lush green forest. The trees are packed closely together, creating a textured canopy of various shades of green. The word "RESULTS" is superimposed in the center-left area of the image in a large, bold, white, sans-serif font. The lighting appears to be natural daylight, casting soft shadows and highlighting the tops of the trees.

RESULTS

1. DATA OVERVIEW

NEXT TO BIO-BASED TEXTILES, ETHICAL OR RECYCLED FASHION ARE ALSO BIG TRENDS ON SOCIAL MEDIA

Top trends in fashion (1 / 2)



Ethical Fashion

Responsible Consumption
Slow Fashion
Clothing Rental



Natural Fabrics

Cotton
Linen



General Sustainable Fashion

Comments on sustainable fashion, which cannot be allocated to any of the categories



Recycled Fashion

Recycled fabrics
Circular design



Bio-Based Textiles

Biodegradable fabrics
Algae, bamboo, corn, hemp
Lyocell, Tencel



Fair Fashion

Ethically made clothes
Fair Trade



Vegan Leather

Corn, pineapple, banana, cactus leather, mushroom leather



Support Local

Supporting local businesses
Shop local



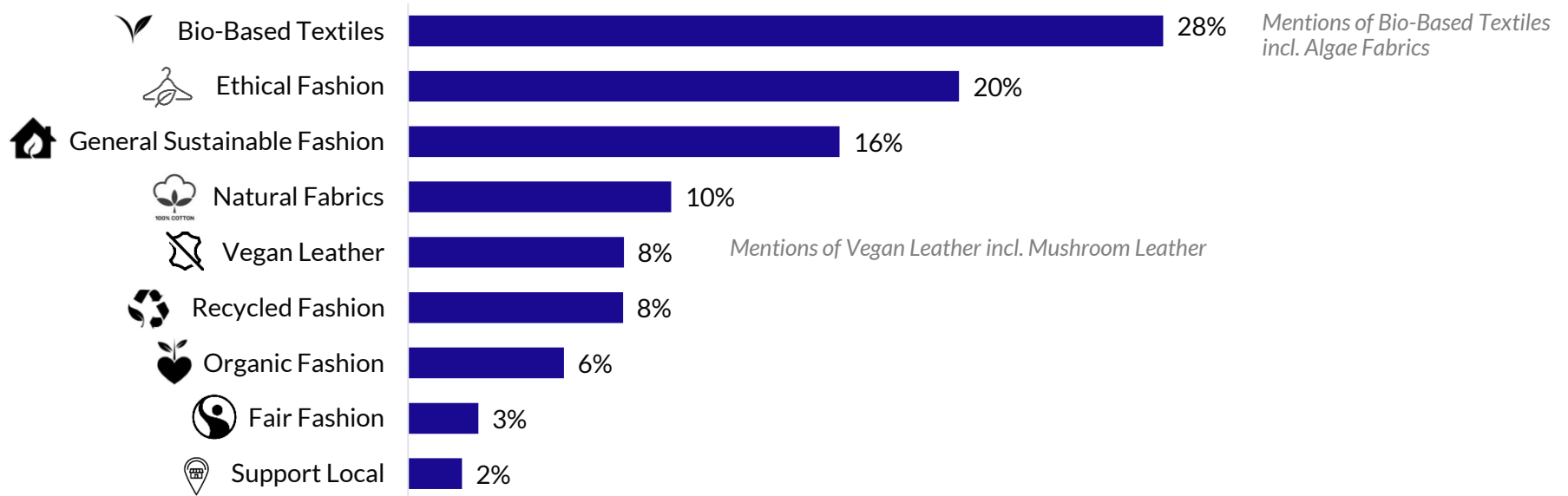
Organic Fashion

Organic materials

BIO-BASED TEXTILES IS THE MOST FREQUENTLY MENTIONED FASHION TREND IN THE COLLECTED DATA

Top trends in fashion (2 / 2)

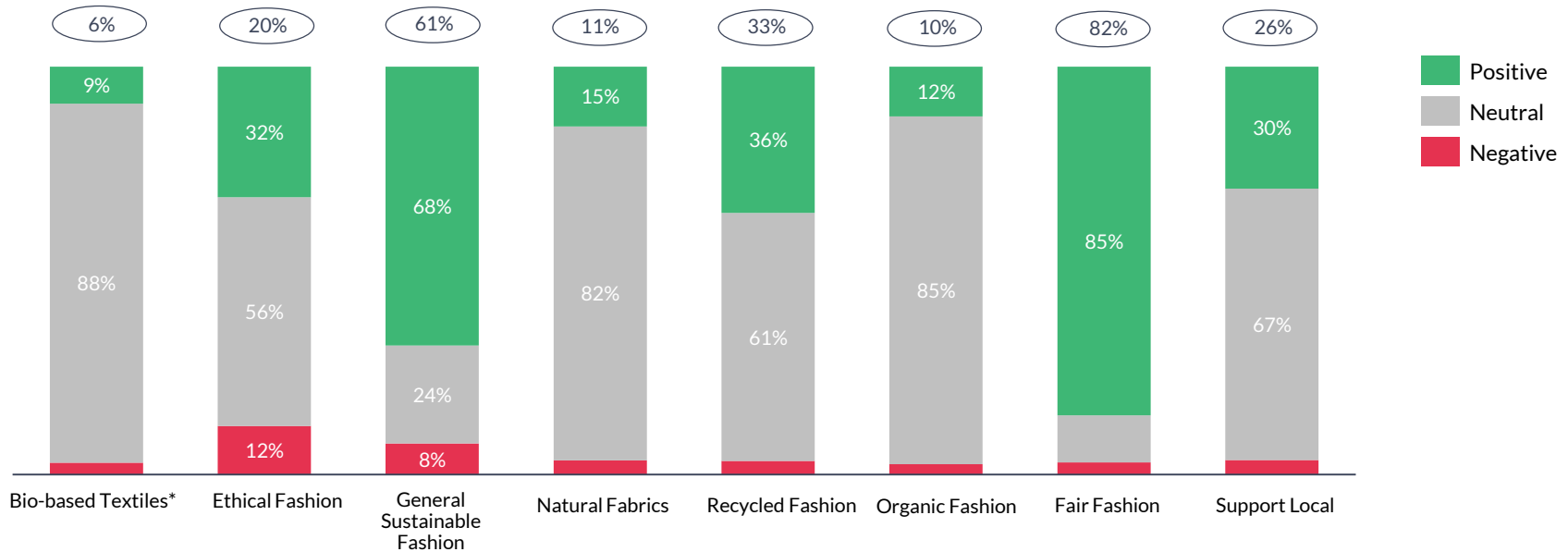
Trends mentioned, % of number of mentions



WHEN PEOPLE TALK ABOUT ETHICAL FASHION, THEY ALSO NEGATIVELY COMMENT ON “FAST FASHION” OPPOSED TO THE “SLOW FASHION” TREND

Net sentiment – High level overview

Discussion Sentiment for Sustainable Fashion, % of total messages



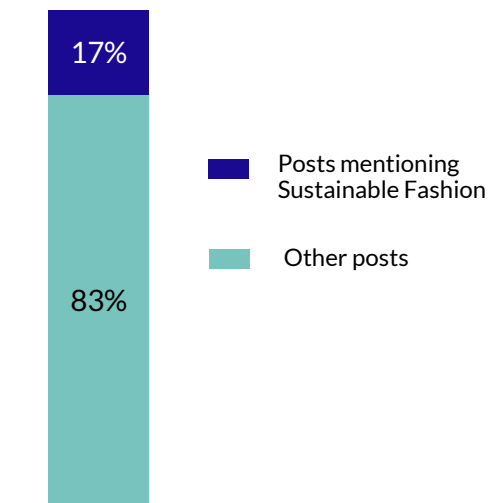
In total, 59,394 mentions of themes were identified & analyzed

*Mentions of Bio-Based Textiles incl. Vegan Leather, Mushroom Leather and Algae Fabrics

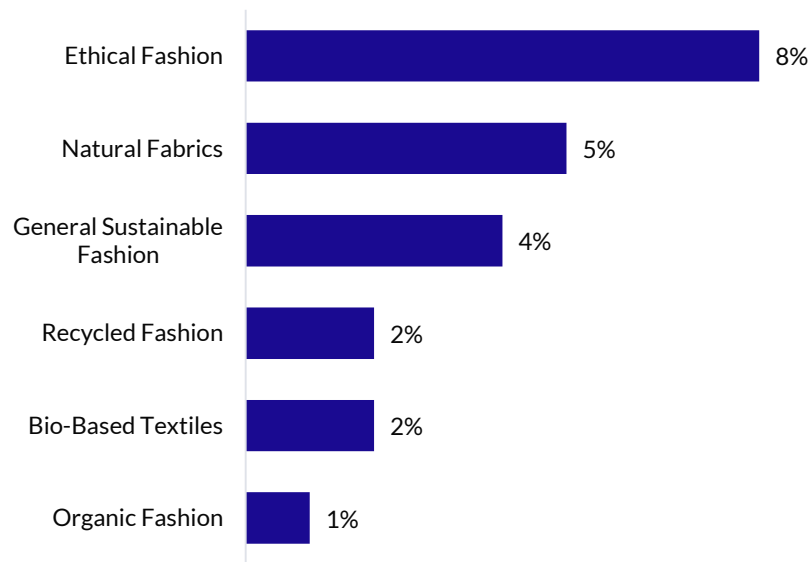
17 % OF ALL POSTS IN THE FASHION INDUSTRY MENTION SUSTAINABLE FASHION, IN PARTICULAR ETHICAL FASHION

Sustainable fashion in fashion industry

Share of Sustainable Fashion mentions in the Fashion industry
% of conversations



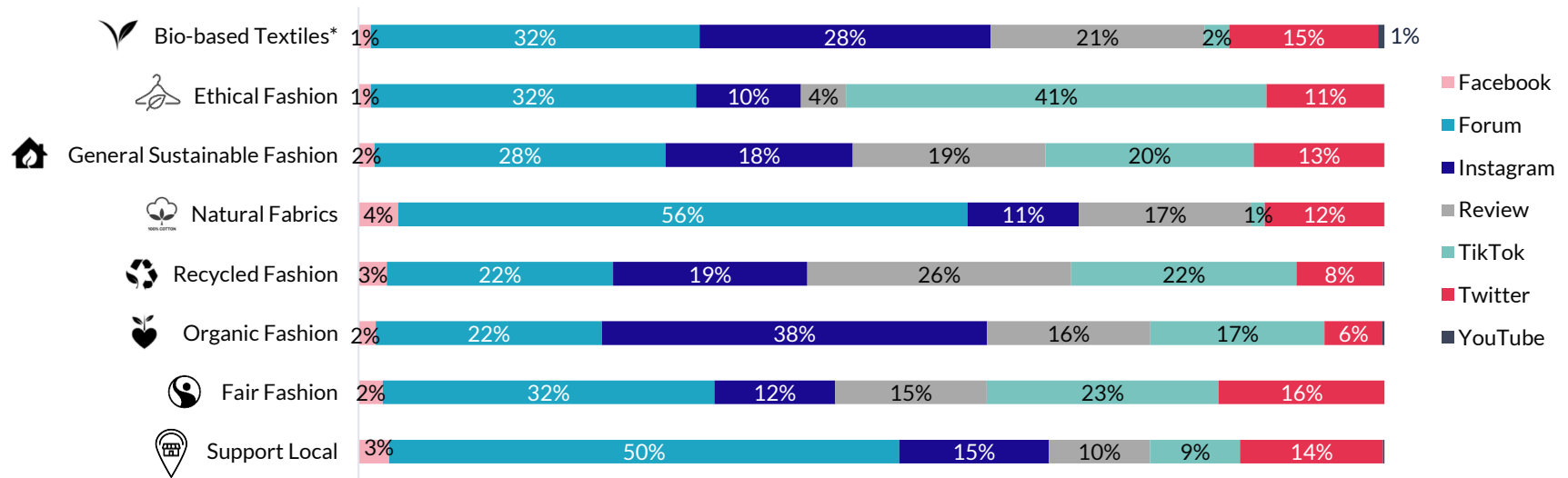
Share of Fashion trends mentions in the Fashion industry
% of conversations



BIO-BASED TEXTILES ARE MOST OFTEN MENTIONED IN FORUMS AND ON INSTAGRAM. ETHICAL FASHION IS HIGHLY DISCUSSED ON TIKTOK

Data sources in sustainable fashion

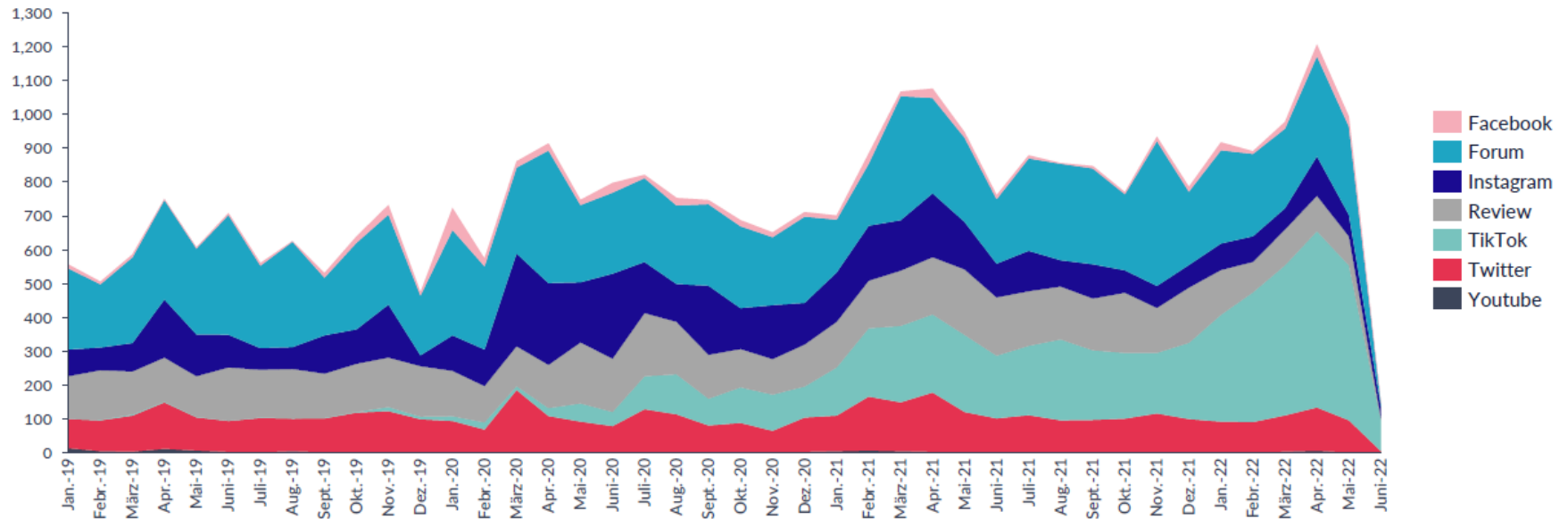
Data sources for Sustainable Fashion comments



ON TIKTOK, COMMENTS ON SUSTAINABLE FASHION ARE RISING, WHILE ON INSTAGRAM, COMPARED TO THE LAST FEW YEARS, THEY ARE FALLING

Trend analysis overview: Sustainable fashion

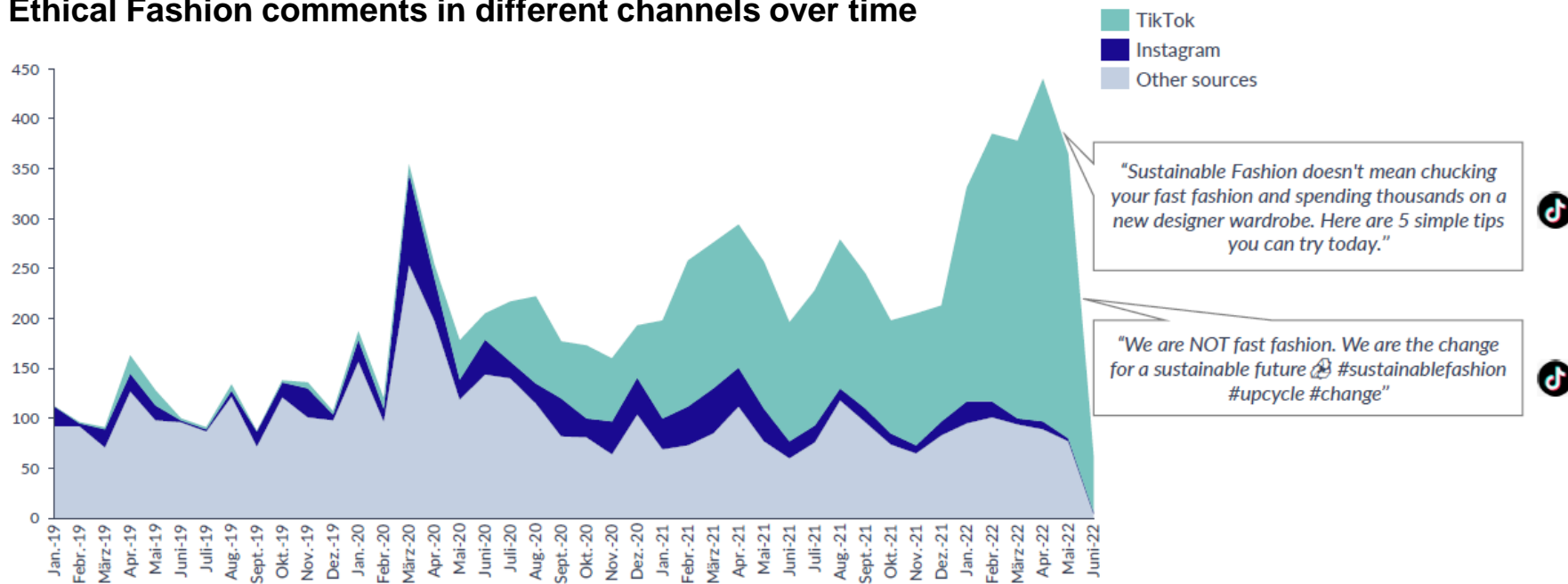
Sustainable Fashion comments in different channels over time



ETHICAL FASHION IS DRIVING THE TREND FOR SUSTAINABLE FASHION ON TIKTOK

Trend analysis overview: Ethical fashion

Ethical Fashion comments in different channels over time

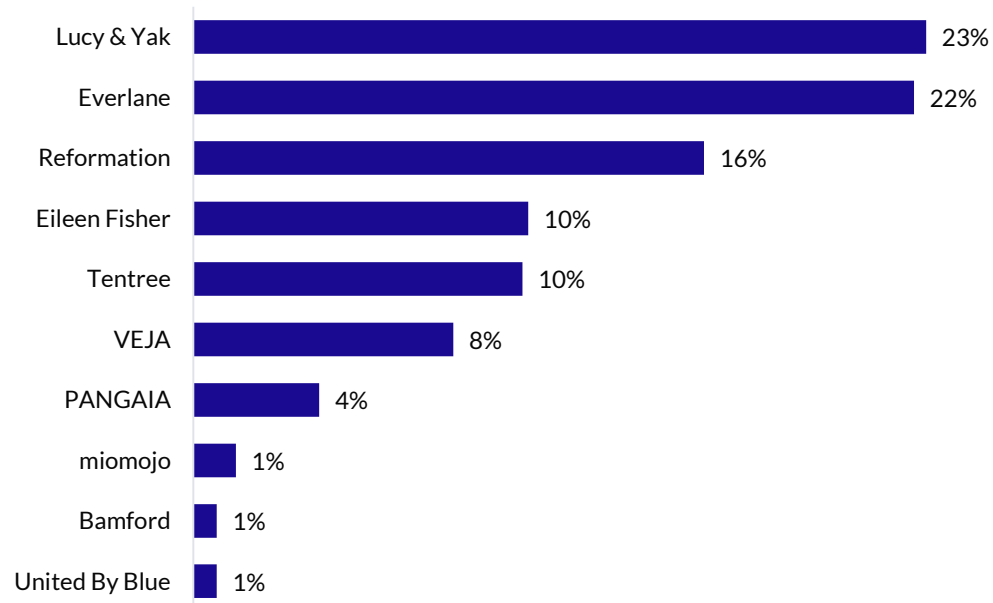


2. BRANDS

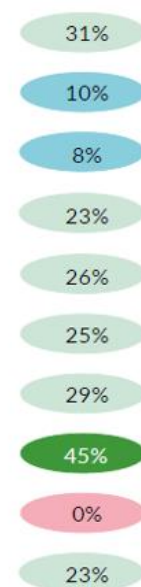
LUCY & YAK IS A LEADER IN TERMS OF VOLUME OF CONVERSATIONS AND IT ALSO HAS A VERY POSITIVE NET SENTIMENT

Top 10 brands in sustainable fashion

Brands overall



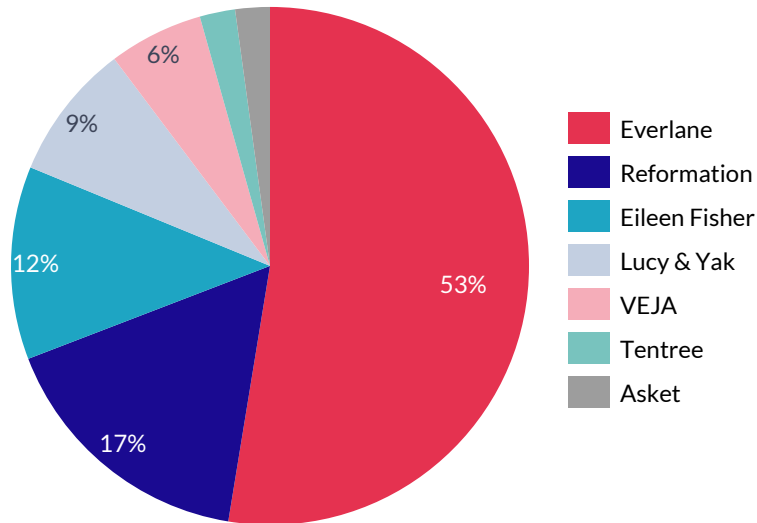
Net Sentiment



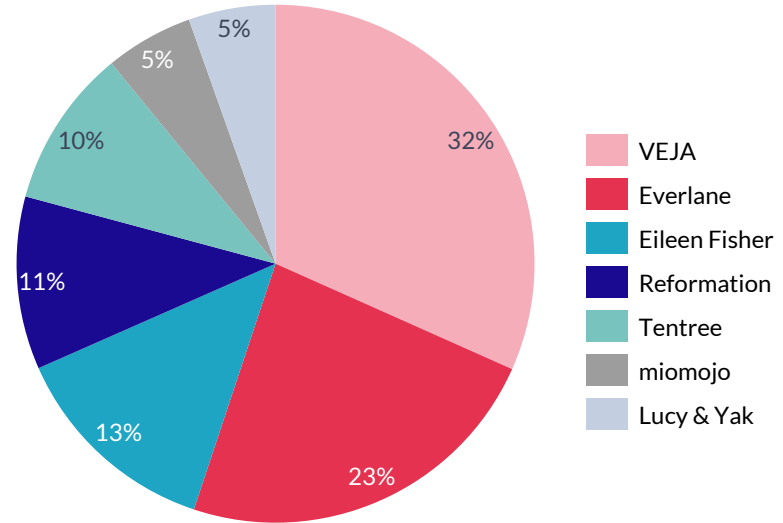
EVERLANE IS THE BRAND WITH THE GREATEST CONNECTION TO ETHICAL FASHION AND VEJA IS THE MOST DISCUSSED BRAND IN BIO- BASED TEXTILES

Top 7 brands in ethical fashion and bio-based textiles

Distribution Ethical Fashion comments
for top 7 brands



Distribution Bio-Based Textiles* comments
for top 7 brands



3. MOTIVATIONS

THERE ARE SIX DIFFERENT MOTIVATIONS BEHIND SUSTAINABLE FASHION

Motivation behind sustainable fashion



Environment

Impact on the environment

Emissions

Biodiversity



Animal welfare

Animal protection

Animal rights

Cruelty free production



Ethics

Ethical supply chain

Fair wages and good working conditions

THERE ARE SIX DIFFERENT MOTIVATIONS BEHIND SUSTAINABLE FASHION

Motivation behind sustainable fashion



Health impact

Impact on skin and body



Innovation

Innovative products and production



Trend

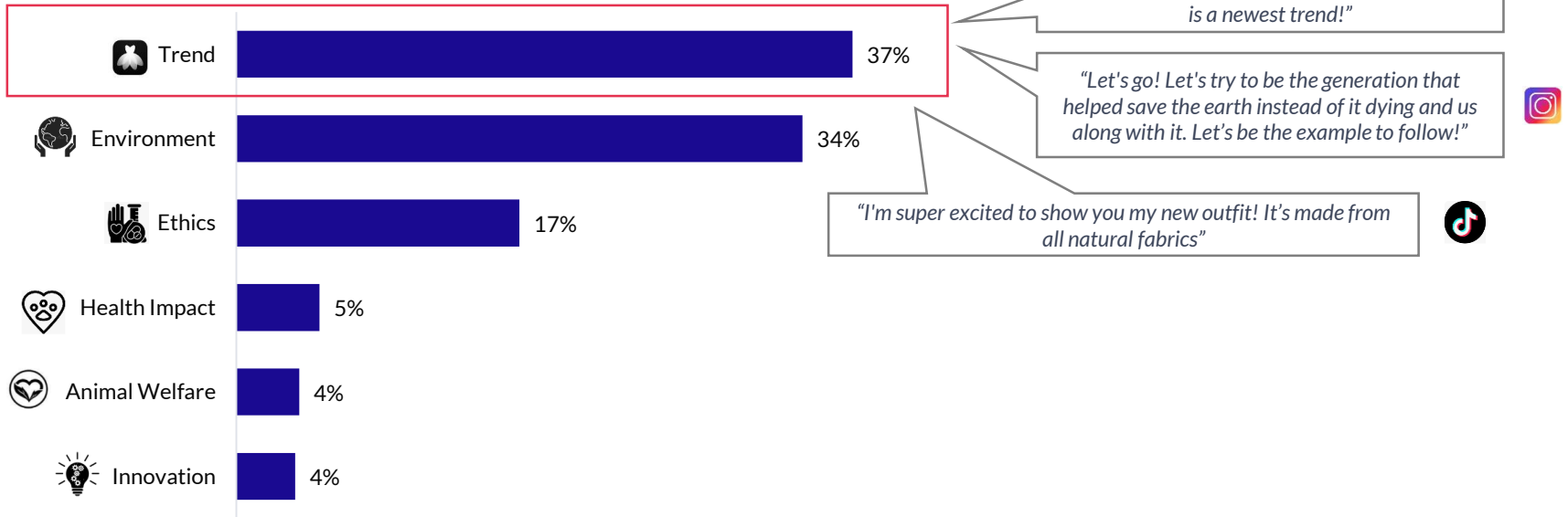
Sustainable fashion is a trend on social media

Influencers / Bloggers

SUSTAINABLE FASHION IS LARGELY A TREND IN FASHION OVERALL, WHICH IS DRIVEN BY SOCIAL MEDIA

Motivation behind sustainable fashion

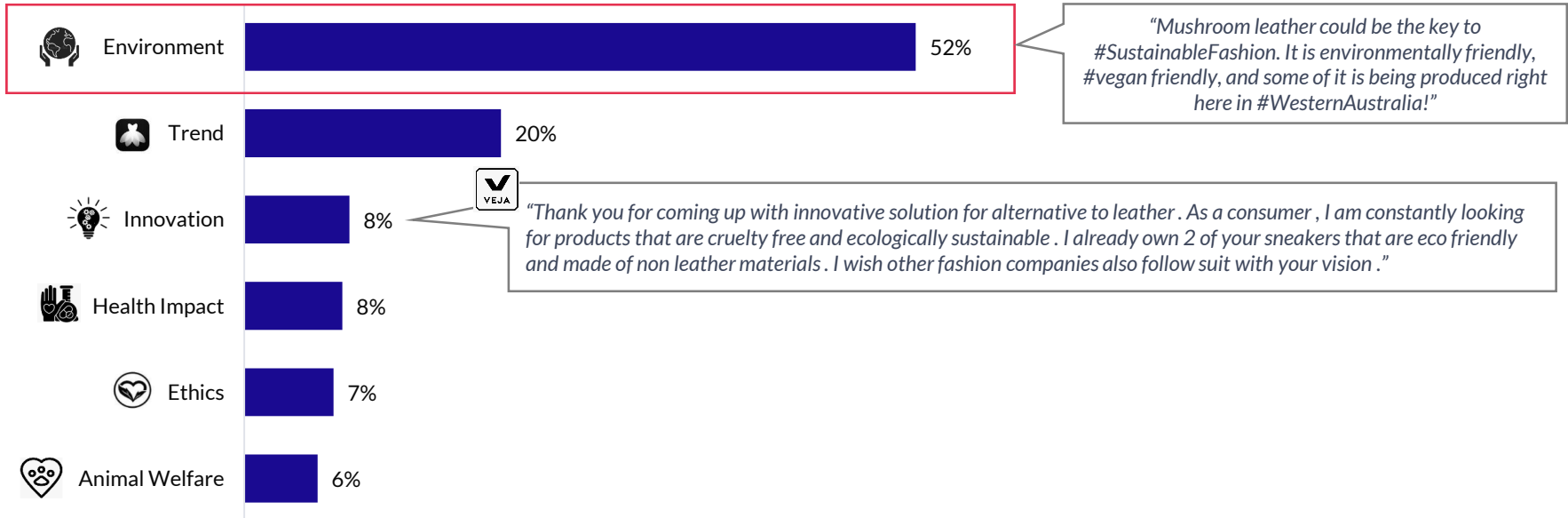
Trends mentioned, % of number of mentions



WHEN PEOPLE TALK ABOUT BIO-BASED TEXTILES, THEY ALSO POSITIVELY MENTION THEIR IMPACT ON THE ENVIRONMENT

Motivation behind bio-based textiles

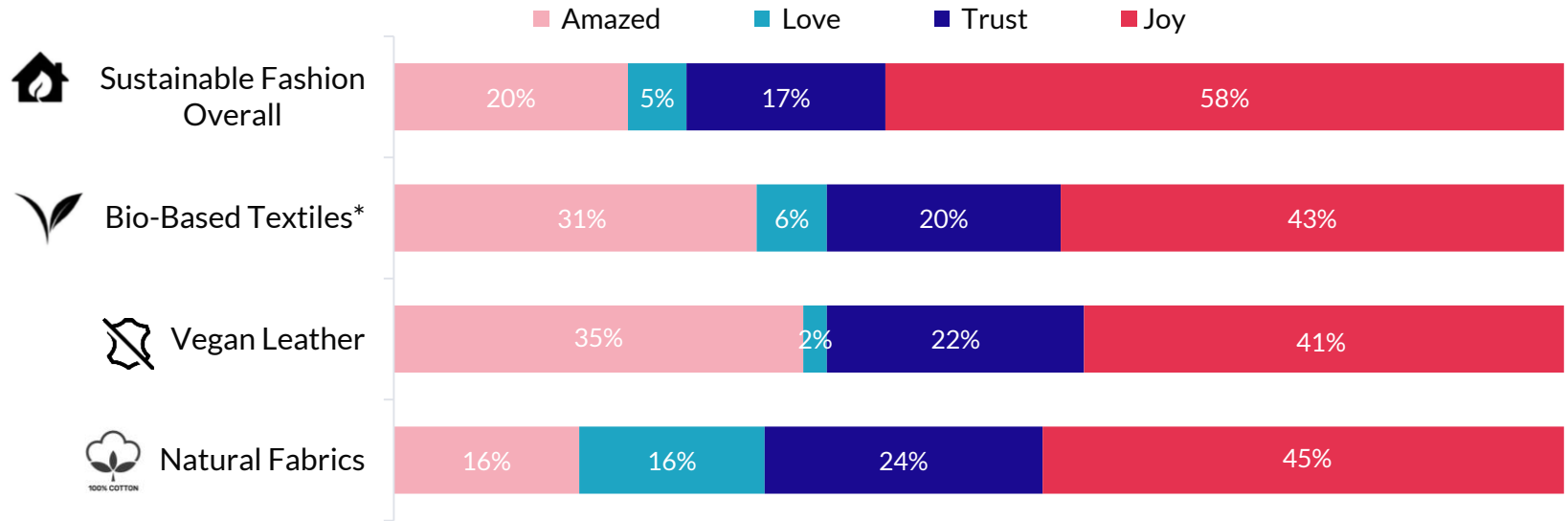
Trends mentioned, % of number of mentions



JOY IS THE EMOTION, WHICH IS EXPRESSED MOST OFTEN IN CONNECTION WITH SUSTAINABLE FASHION

Positive emotional drivers behind sustainable fashion

Positive emotional drivers in sustainable fashion comments



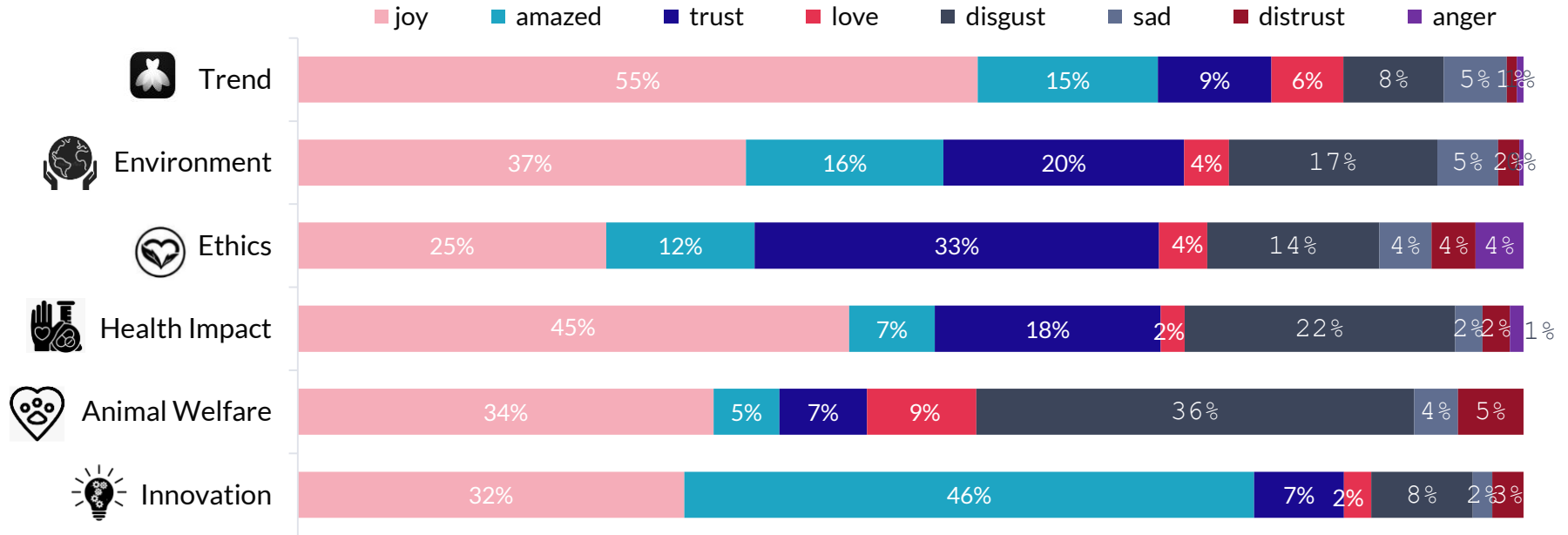
In total, 9.660 mentions of themes were identified & analyzed

*Mentions of Bio-Based Textiles incl. Algae Fabrics

WHEN TALKING ABOUT ETHICS AND ENVIRONMENT PROTECTION PEOPLE ALSO EXPRESS TRUST

Emotions behind motivations

Emotions behind motivation comments



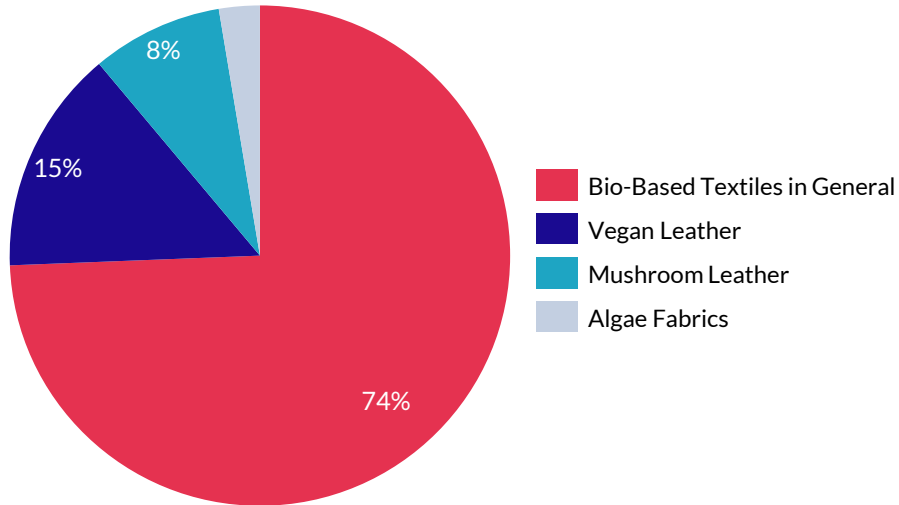
In total, 9,288 mentions of themes were identified & analyzed

4. TOPICS

BIO-BASED TEXTILES, INCL. TENCEL AND OTHER PLANT-BASED FABRICS, ARE MOST FREQUENTLY MENTIONED IN THIS ANALYSIS

Bio-based textiles: Topics Deep Dive

Distribution Bio-Based Textiles topics



Words Bio-Based Textiles topics



WHEN PEOPLE TALK ABOUT BIO-BASED TEXTILES, THEY POSITIVELY MENTION THE QUALITY OF THE FABRICS

Topics mentioned in connection with bio-based textiles

When they talk about Bio-Based Textiles, they also talk positively on other topics



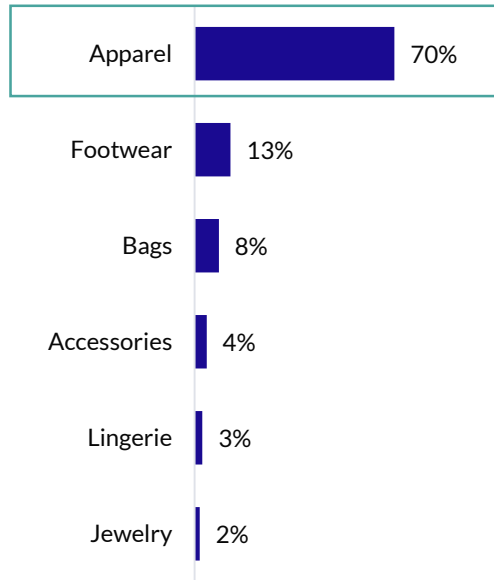
When they talk about Bio-Based Textiles, they also talk negatively on other topics



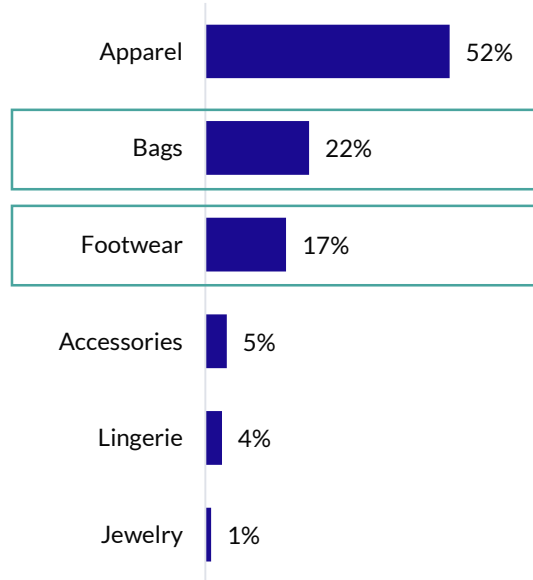
IN MOST CONVERSATIONS ON SUSTAINABLE FASHION PEOPLE MAINLY MENTION APPAREL

Products mentioned in connection with sustainable fashion

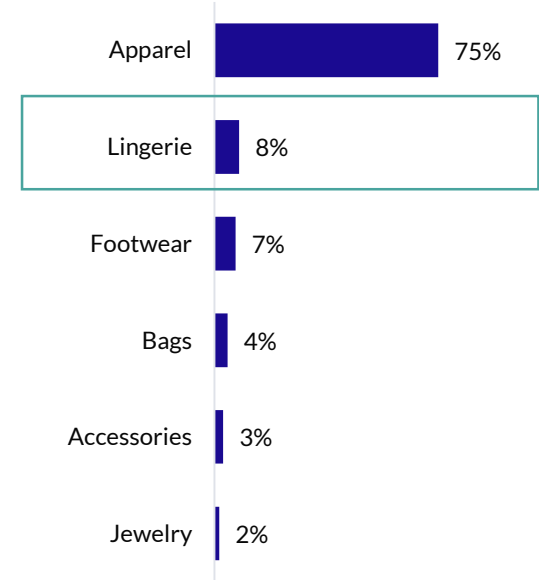
Products in connection with Sustainable Fashion all topics



Products in connection with Bio-Based Textiles



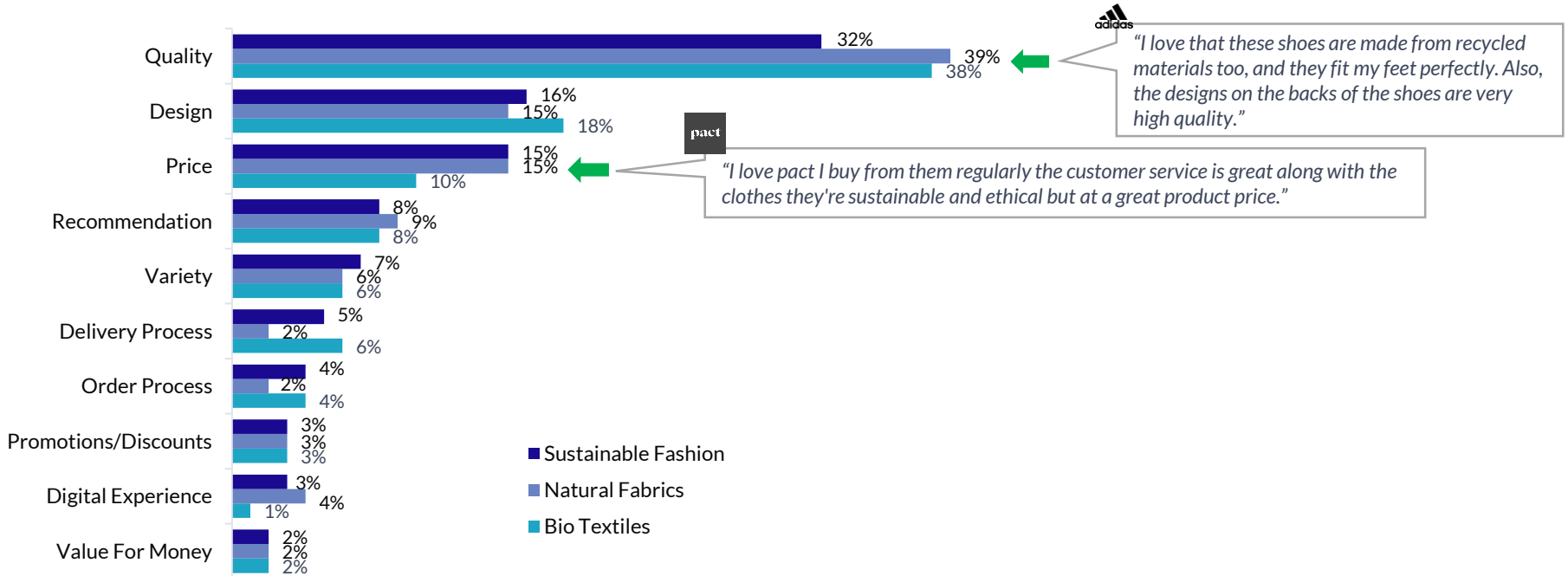
Products in connection with Organic Fabric



NATURAL FABRICS AND BIO-BASED TEXTILES ARE MAINLY PRAISED FOR THEIR QUALITY

What product aspects people praise when they discuss sustainable fashion

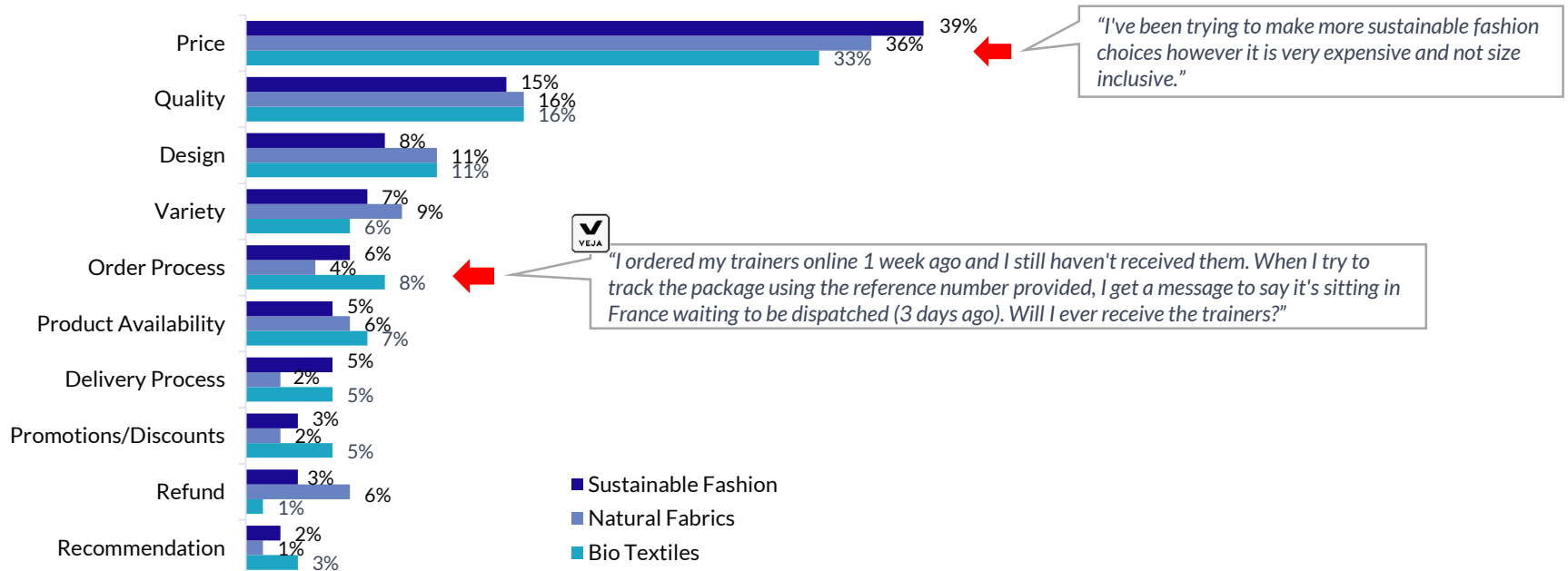
Positive Comments on Product Aspects in connection with Sustainable Fashion overall, Natural Fabrics and Bio-based Textiles



WHEN PEOPLE TALK ABOUT BIO-BASED TEXTILES, PRICE IS THEIR PRIMARY SOURCE OF COMPLAINTS

What product aspects people criticize when they discuss Sustainable Fashion

Negative Comments on Product Aspects in connection with Sustainable Fashion overall, Natural Fabrics and Bio-based Textiles

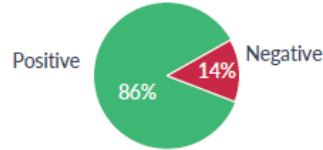


WHEN PEOPLE TALK ABOUT THE QUALITY OF SUSTAINABLE FASHION, THEY EMPHASIZE THE COMFORT OF THE PRODUCTS

Quality Deep Dive

Positive Sentiment Word Cloud

VERY NICE QUALITY
 THE QUALITY IS GREAT QUALITY IS GREAT
 AMAZING QUALITY
 WATER RESISTANT BETTER QUALITY HIGHEST QUALITY
 QUALITY ITEMS BREATHABLE
 QUALITY PRODUCT DURABLE EXCELLENT QUALITY
 NICE QUALITY HIGH QUALITY RESISTANT



Negative Sentiment Word Cloud

MANUFACTURING DEFECT
 NOT VERY COMFORTABLE
 NOT BREATHABLE LOWER QUALITY EXPECTED BETTER QUALITY
 A BETTER QUALITY LOOKED CHEAP
 TERRIBLE QUALITY DEFECTIVE CHEAPLY MADE
 LOVE THE QUALITY FEELS CHEAP MORE QUALITY

COMFORTABLE

POOR QUALITY

LIKE THE QUALITY GOOD QUALITY EASY TO CLEAN
 QUALITY PRODUCTS GREAT QUALITY DECENT QUALITY
 TOP QUALITY GOOD PRODUCT QUALITY GOOD
 THE QUALITY IS GOOD QUALITY IS GOOD
 ROBUST THE QUALITY IS EXCELLENT
 QUALITY : GOOD

HORRIBLE QUALITY QUALITY ISSUES LOW QUALITY DEFECT CHEAP QUALITY
 NOT GOOD QUALITY WAS DEFECTIVE NOT COMFORTABLE
 FEEL CHEAP DEFECTS CHEAP LOOKING
 TO IMPROVE THE QUALITY
 NOT AS COMFORTABLE
 DISAPPOINTED WITH THE QUALITY

5. CONSUMER SEGMENTS

ALLOCATION OF SEGMENTED PROFILES IS BASED ON DEEP-LEARNING CLUSTERING

Segment overview (1 / 4)

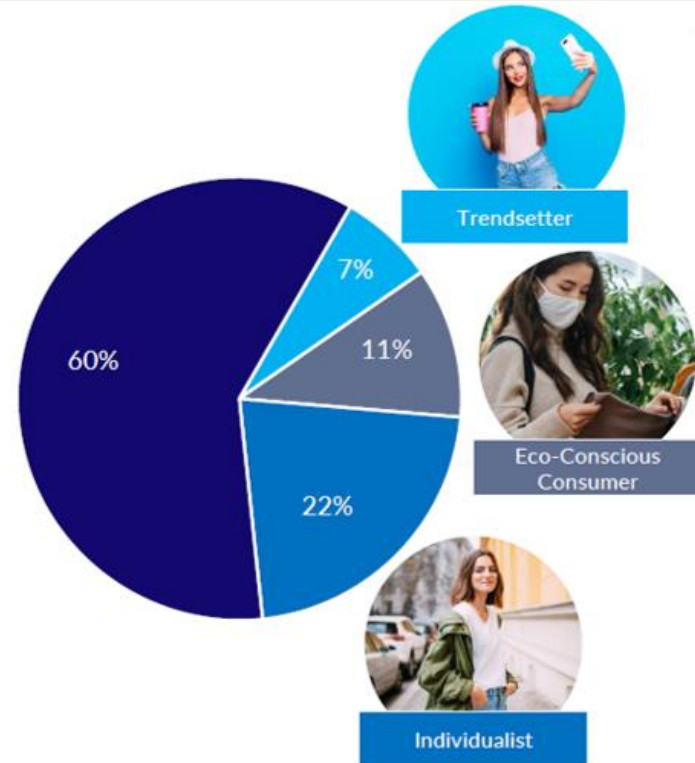
MAINSTREAM

General

- Emotional
- Subjective

Details

- Focus on their feeling & experience, when making decisions
- Follow the trends in Sustainable Fashion, incl. Slow Fashion trend
- Mainly discuss service and quality



ALLOCATION OF SEGMENTED PROFILES IS BASED ON DEEP-LEARNING CLUSTERING

Segment overview (2 / 4)

INDIVIDUALIST

General

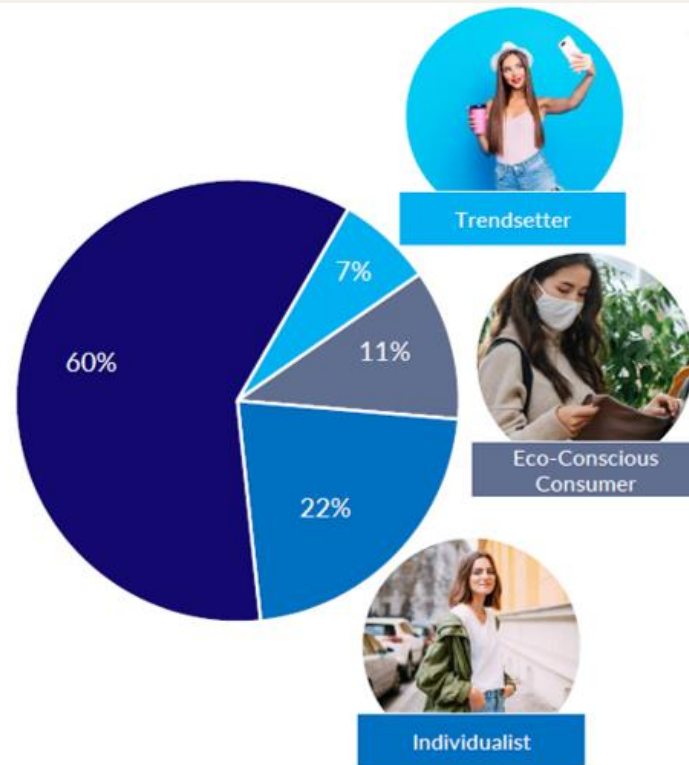
- Rational
- Subjective
- Own experience matters



Mainstream

Details

- Decisions are made often by rational arguments & own experiences
- When buying clothes, care about quality
- Interested in natural fabrics and vegan leather



ALLOCATION OF SEGMENTED PROFILES IS BASED ON DEEP-LEARNING CLUSTERING

Segment overview (3 / 4)

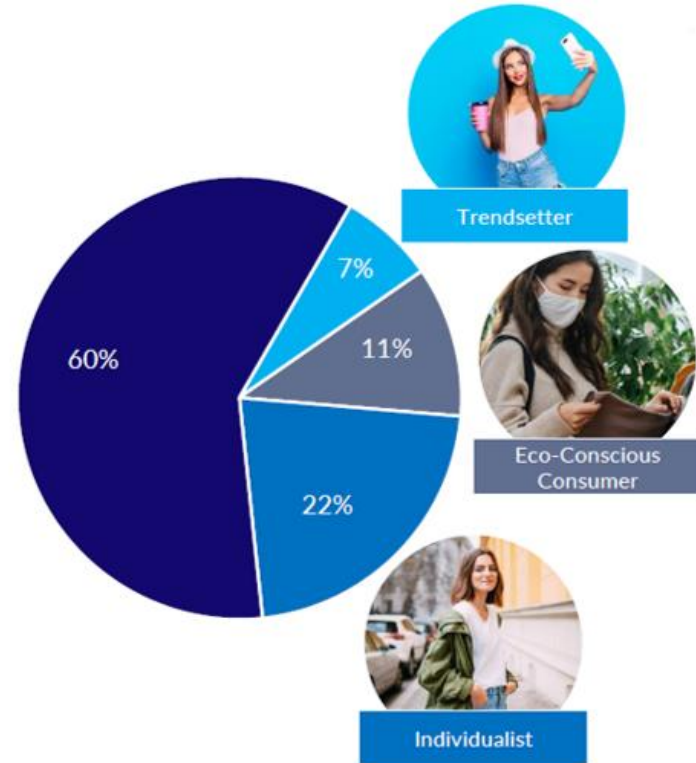
ECO-CONSCIOUS CONSUMER

General

- Rational
- Fact-oriented

Details

- Rational decision makers, which highly care about environment
- Most actively discuss Bio-Textiles



ALLOCATION OF SEGMENTED PROFILES IS BASED ON DEEP-LEARNING CLUSTERING

Segment overview (4 / 4)

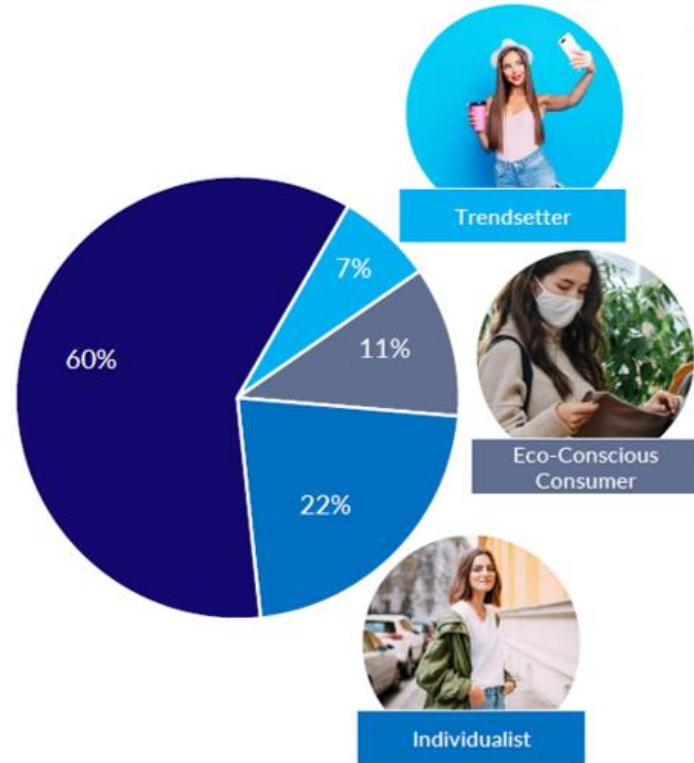
TRENDSETTER

General

- Emotional
- Action-Seeking

Details

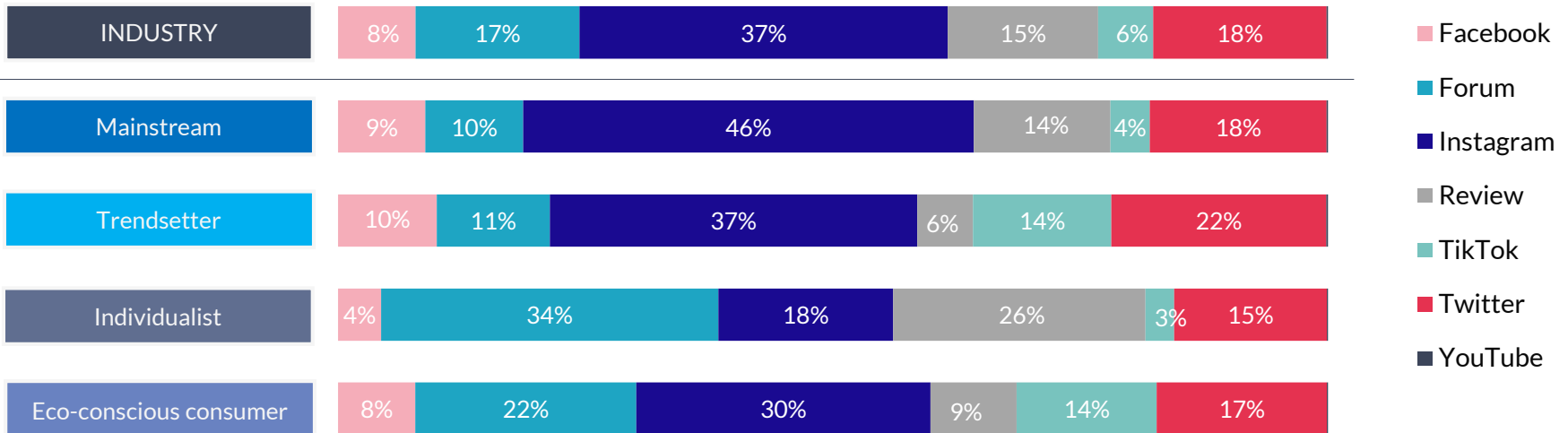
- Emotional decision makers
- Heavy users of social media
- Post content on fashion and style (in particular, ethical fashion)



MAINSTREAM AND TRENDSETTERS ARE MAINLY INSTAGRAM USERS. TREND-SETTERS ARE ALSO HIGHLY REPRESENTED ON FACEBOOK, TIKTOK AND TWITTER

Channel distribution per segment

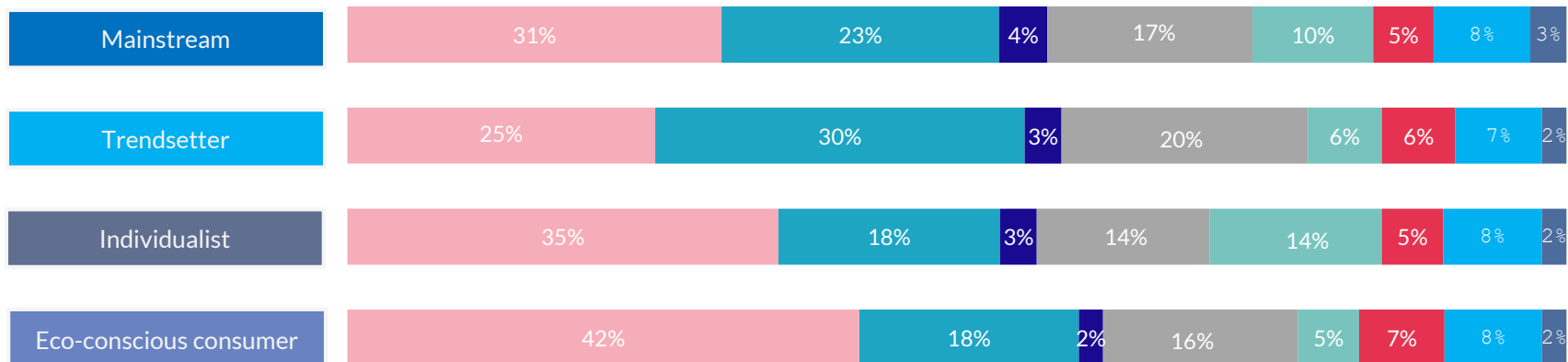
Distribution of sources per segment



ECO-CONSCIOUS CONSUMERS ARE CLEARLY LEADING IN TERMS OF BIOTEX DISCUSSIONS

Fashion theme per segment

Distribution of themes per segment

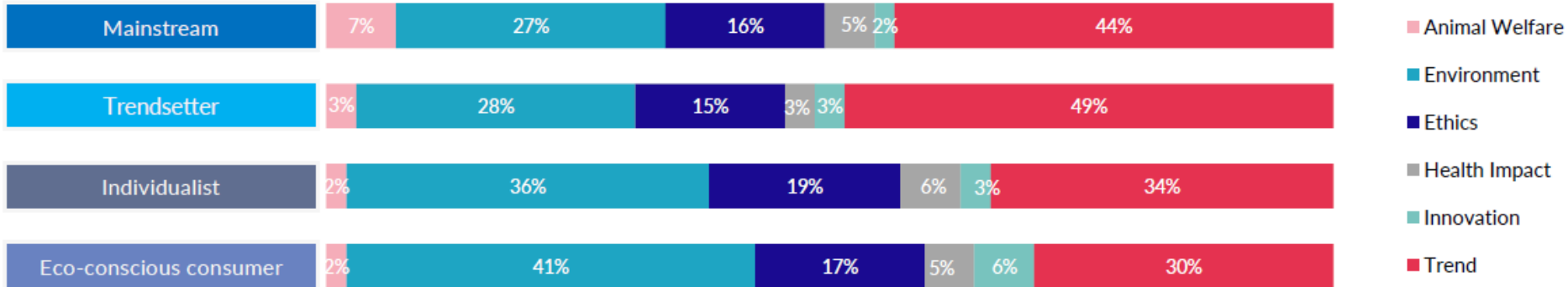


■ Bio-based Textiles
 ■ Ethical Fashion
 ■ Fair Fashion
 ■ General Sustainable Fashion
 ■ Natural Fabrics
 ■ Organic Fashion
 ■ Recycled Fashion
 ■ Support Local

ECO-CONSCIOUS CONSUMER IS THE SEGMENT WHICH CARES MOST ABOUT THE ENVIRONMENT

Motivation per segment

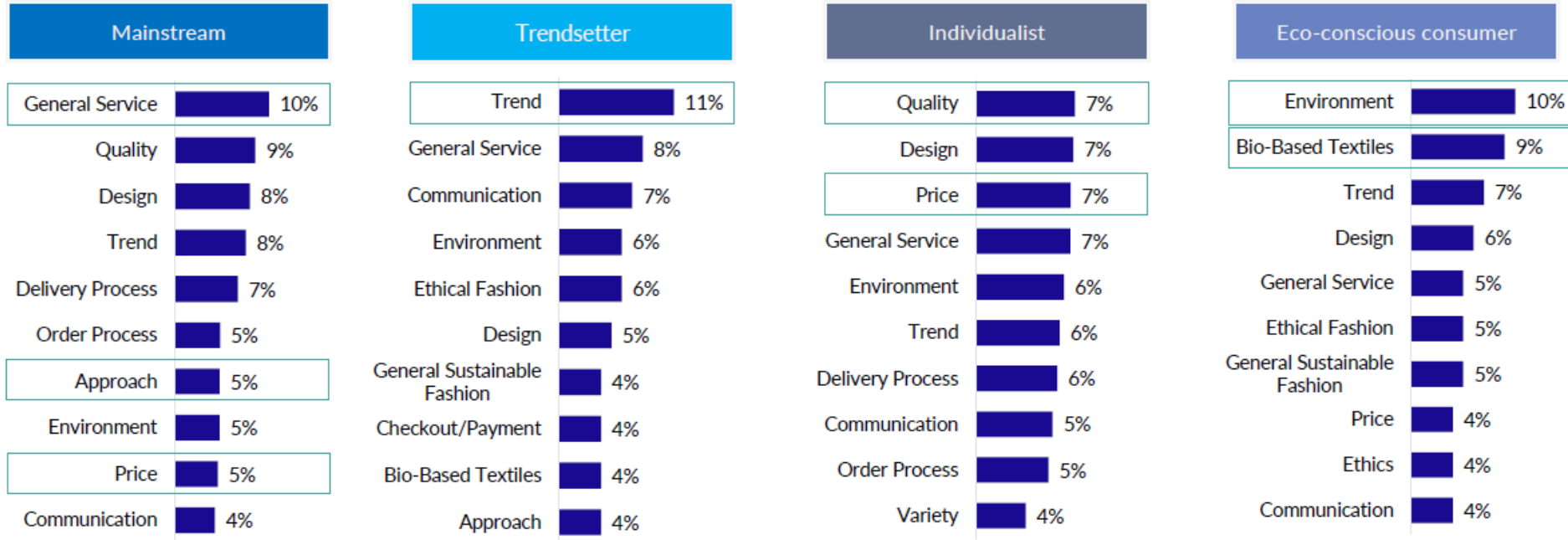
Distribution motivation comments per segment



In total, 73.954 mentions of motivations were identified & analyzed

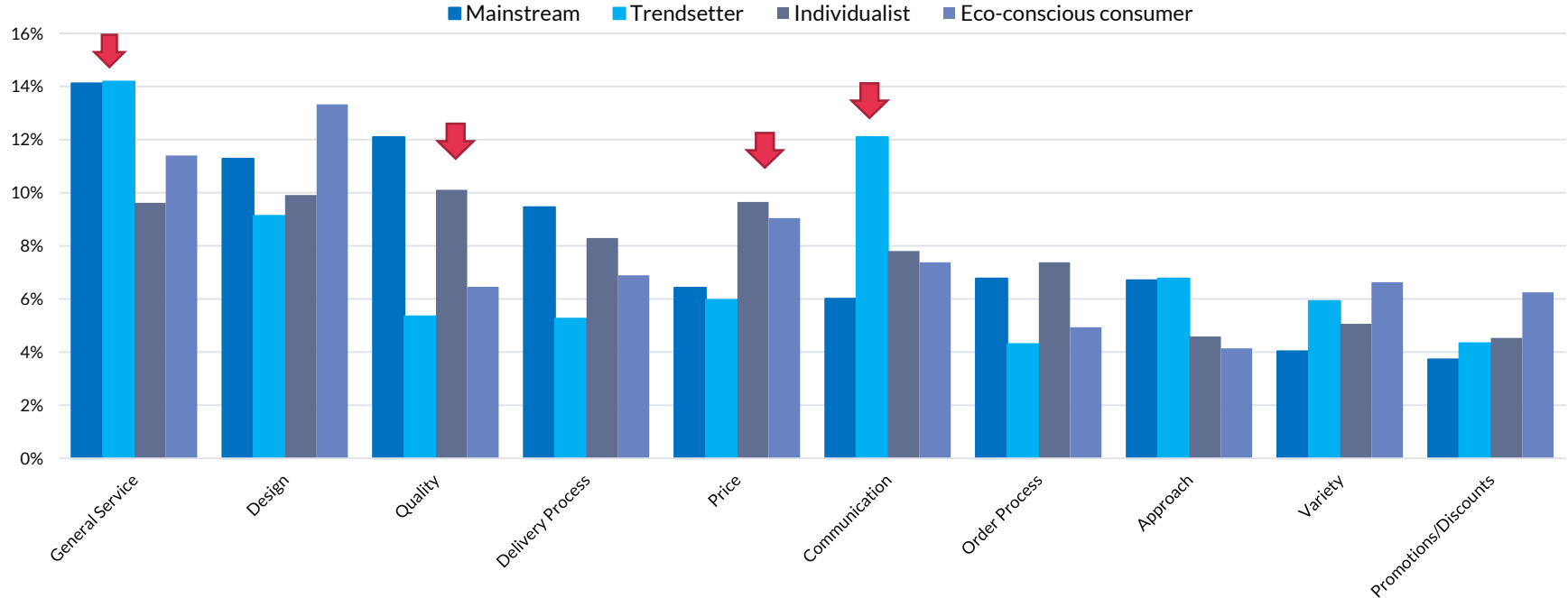
IF WE LOOK AT ALL TOPICS OF SUSTAINABLE FASHION, WE SEE THAT MAINSTREAM VALUES SERVICE

Topic drivers per segment



MAINSTREAM AND TRENDSETTERS HIGHLY CARE ABOUT SERVICE, WHILE THE INDIVIDUALISTS OFTEN MENTION QUALITY AND PRICE

Product aspects and service per segment

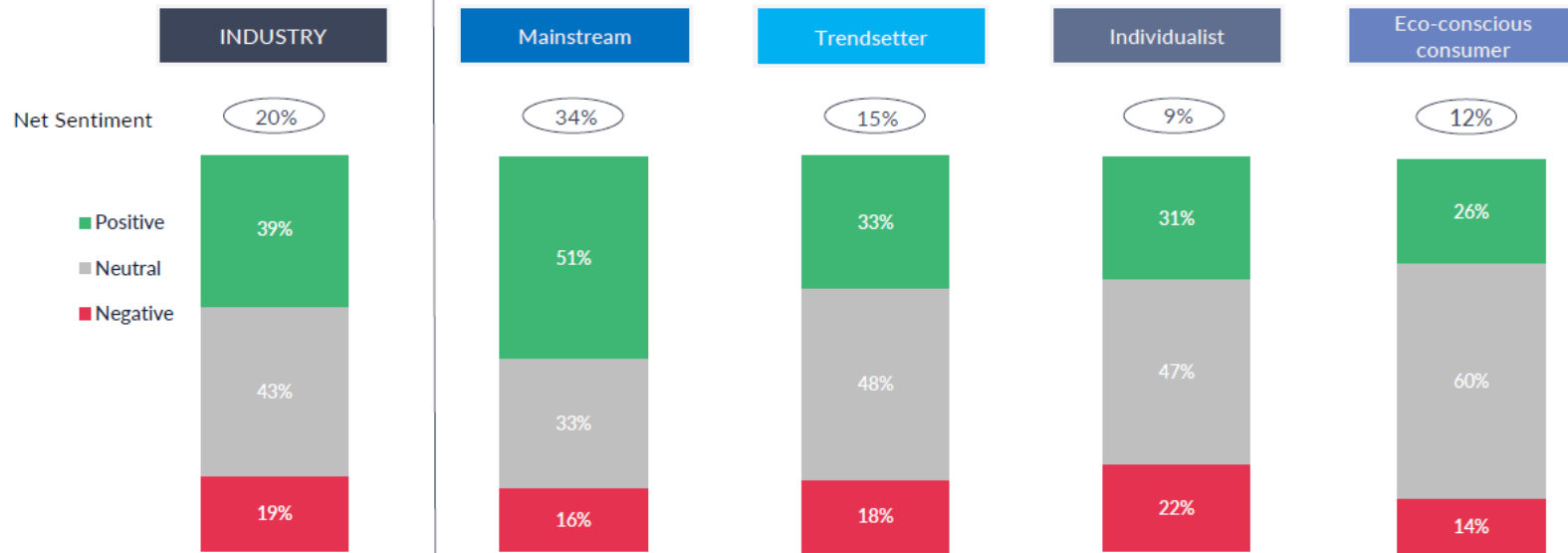


In total, 379:285 mentions of product aspects and service were identified & analyzed

MAINSTREAM HAS BY FAR THE BEST NET SENTIMENT COMPARED TO OTHER SEGMENTS, WHILE INDIVIDUALISTS ARE THE MOST CRITICAL CONSUMERS

Sentiment per segment

Discussion Sentiment, % of total messages

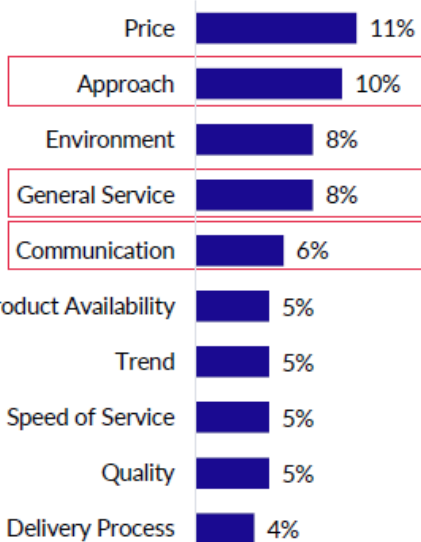


In total, 658:856 mentions of themes were identified & analyzed

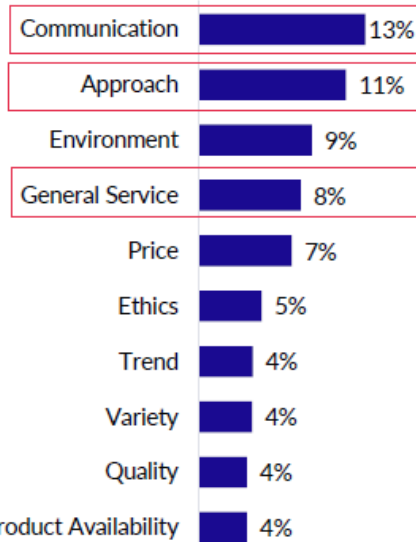
AMONG ALL TOPICS, MAINSTREAM AND TRENDSETTERS EXPRESS MOST COMPLAINTS ABOUT CUSTOMER SERVICE, ITS APPROACH AND COMMUNICATION

Negative comments for each segment

Mainstream



Trendsetter



Individualist



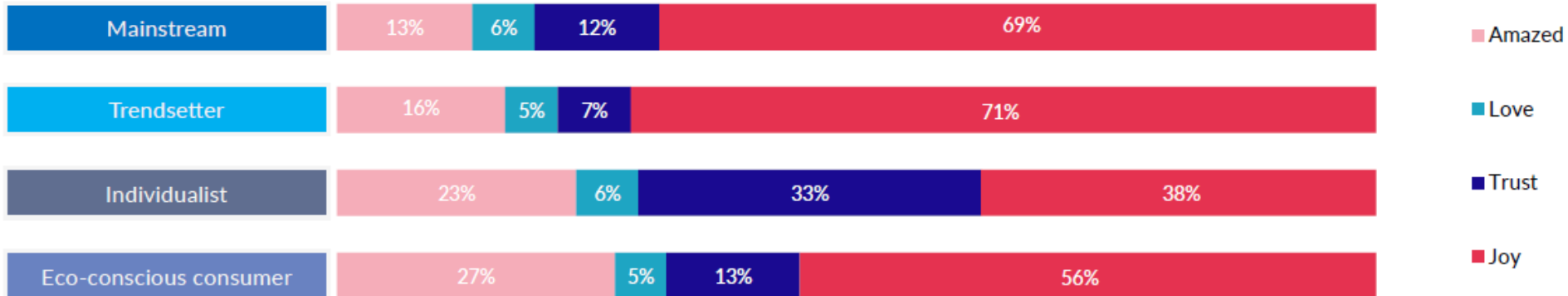
Eco-conscious consumer



THE MAIN POSITIVE EMOTION EXPRESSED BY THE MAINSTREAM AND TRENDSETTERS IS JOY, WHEN THEY WRITE ABOUT SUSTAINABLE FASHION TREND

Emotional drivers for sustainable fashion per segment

Distribution of emotional drivers per segment



An aerial photograph of a dense, lush green forest. The trees are packed closely together, creating a textured canopy of various shades of green. The word "DASHBOARD" is superimposed in the center-left of the image in a large, bold, white, sans-serif font. The text is clearly legible against the darker green background of the forest.

DASHBOARD

THE SUSTAINABLE & BIO-BASED SOCIAL MEDIA INSIGHTS DASHBOARD

- To display the results of the social media analysis in a comprehensible manner, a **dashboard containing all results** was created.
- The dashboard allows different kinds of **filter options**, so that the results can be looked into in a more granular way than looking at them statically.
- The dashboard is **updated with new input data on a daily basis** until November 30th, 2022.
- In the dashboard, viewers get an overview over **fashion trends, motivations behind sustainable and bio-based products, important product attributes of sustainable and bio-based products, sentiment deep dive, important brands leading the sustainable fashion movement and consumer segments.**

PERIOD

01.01.2019 16.06.2022



Level of Analysis

Alle

Fashion trend

Alle

Source

Alle

Product category

Alle

Segment

Alle

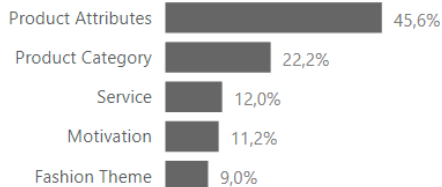
Sentiment

Alle

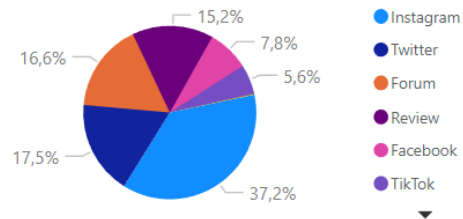
Brand

Alle

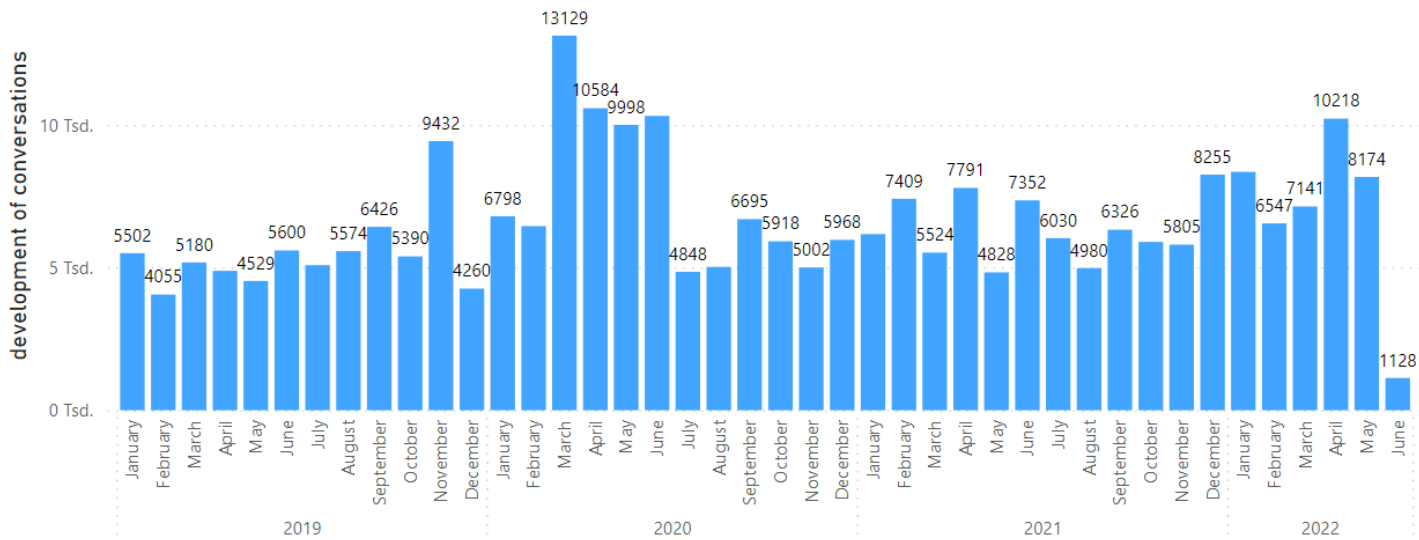
LEVEL OF ANALYSIS



SOURCES



274571
#CONVERSATIONS



An aerial photograph of a dense forest. The trees are mostly green, with some brown and greyish trees scattered throughout, suggesting a mix of species or perhaps some dead trees. The lighting is natural, creating a textured canopy.

OUTLOOK & IMPLICATIONS

WITH OUR RESEARCH, WE HELP ANSWER THE QUESTION HOW THE DIFFUSION OF BIO-BASED PRODUCTS CAN BE ACHIEVED

Next, together with our partners we will develop...



1. Target-group oriented communication and marketing concepts

2. Product variations according to each consumer segment



3. Different distribution strategies and channels

4. Pricing strategies for different consumer segments



MARKETING CONCEPTS TARGETING THE MAINSTREAM AND TRENDSETTER SHOULD FOCUS ON EMOTIONS AND SERVICE QUALITY

1. Target-group oriented communication and marketing concepts

MAIN-STREAM

- Focus on emotions (particularly joy)
- Communicate high quality and high service level
- Stress experiences made with the product / customer journey

ECO-CON-SCIOUS

- Focus on facts
- Joy & amazement as emotional drivers
- Communicate positive influence on the environment
- Stress rational facts & design options



INDI-VIDUA-LIST

- Focus on rational arguments
- Building trust is important
- Communicate high quality and positive influence on the environment
- Stress experiences made with the product & materials (e.g. vegan leather)

TREND-SETTER

- Focus on action-seeking content
- Communicate social factors of sustainable fashion
- Stress high service quality & trends

FOR TRENDSETTERS CELEBRITY-FEATURED VARIATIONS AND CUSTOMISED PRODUCT LINES ARE A POSSIBILITY

2. Product variations according to each consumer segment

MAIN- STREAM

- Following trends
- High quality
- Innovative, creative, stylish variations
- Breathable materials

ECO- CON- SCIOUS

- Different design options (i.e. colours)
- Second hand, renewable variations



INDI- VIDUA- LIST

- Focus on rational arguments
- High material quality (vegan leather)
- Eco-friendly, healthy, durable variations
- Possibility to customise products

TREND- SETTER

- Product lines featured by celebrities / influencers
- Possibility to customise products

INSTAGRAM AS A MAIN CHANNEL FOR ALMOST ALL CUSTOMER SEGMENTS, WHEREBY INDIVIDUALISTS ARE ACTIVE IN FORUMS

3. Different distribution strategies and channels

MAIN-STREAM

- Main channel: Instagram (almost 50 %)
- Stores as offline alternative: so customers can feel the fabrics → own experience matters

ECO-CON-SCIOUS

- Main channel: Instagram
- Forums are also very important to discuss subjects on ecofriendly-/sustainable fashion



INDIVIDUALIST

- Very active in forums to communicate their experiences
- Rely heavily on products reviews

TREND-SETTER

- Active on Instagram & Twitter
- Communication with others is key (posting thoughts on the product, liking videos/pictures)
- Followers of eco-conscious accounts

PRICING STRATEGIES HAVE TO CONSIDER THE PRICE-SENSIBILITY OF EACH CUSTOMER SEGMENT

4. Pricing strategies for different customer segments

MAIN-STREAM

- Price sensitive
- Importance of quality
- Promotion / bundle pricing
- Penetration pricing (starting with lower prices to gain market share)

ECO-CONSCIOUS

- Dynamic pricing (seasonal changes)



INDIVIDUALIST

- Price sensitive
- Importance of quality
- Psychological pricing

TREND-SETTER

- Charging higher prices for special (featured) product lines

THANK YOU FOR YOUR KIND ATTENTION

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