# **Exploring Cannabis**Data from Leafly.com



A dank analysis by Kevin McMorrow, Conner Sexton





- Cannabis data on 2,350 unique strains
- Type: indica, sativa, or hybrid (indica & sativa)
- Rating: Leafly's 0-5 user-rating scale (avg. score)
- Effects: 13 unique effects
- Flavors: 49 unique flavors
- Description: background description

### **Data Management**



^	Strain	Type ‡	Rating <sup>‡</sup>	Effects	Flavor
1	100-Og	hybrid	4.0	Creative,Energetic,Tingly,Euphoric,Relaxed	Earthy,Sweet,Citrus
2	98-White-Widow	hybrid	4.7	Relaxed,Aroused,Creative,Happy,Energetic	Flowery, Violet, Diesel
3	1024	sativa	4.4	Uplifted,Happy,Relaxed,Energetic,Creative	Spicy/Herbal,Sage,Woody
4	13-Dawgs	hybrid	4.2	Tingly,Creative,Hungry,Relaxed,Uplifted	Apricot,Citrus,Grapefruit
5	24K-Gold	hybrid	4.6	Happy,Relaxed,Euphoric,Uplifted,Talkative	Citrus,Earthy,Orange
6	3-Bears-Og	indica	0.0	None	None
7	3-Kings	hybrid	4.4	Relaxed,Euphoric,Happy,Uplifted,Hungry	Earthy,Sweet,Pungent
8	303-Og	indica	4.2	Relaxed,Happy,Euphoric,Uplifted,Giggly	Citrus,Pungent,Earthy
9	3D-Cbd	sativa	4.6	Uplifted,Focused,Happy,Talkative,Relaxed	Earthy,Woody,Flowery
10	3X-Crazy	indica	4.4	Relaxed,Tingly,Happy,Euphoric,Uplifted	Earthy,Grape,Sweet

^	Creative <sup>‡</sup>	Energetic <sup>‡</sup>	Tingly <sup>‡</sup>	Euphoric <sup>‡</sup>	Relaxed <sup>‡</sup>	Aroused <sup>‡</sup>	Нарру 🗦	Uplifted <sup>‡</sup>
100-Og	1	1	1	1	1	0	0	0
98-White-Widow	1	1	0	0	1	1	1	0
1024	1	1	0	0	1	0	1	1
13-Dawgs	1	0	1	0	1	0	0	1
24K-Gold	0	0	0	1	1	0	1	1
3-Bears-Og	0	0	0	0	0	0	0	0
3-Kings	0	0	0	1	1	0	1	1
303-Og	0	0	0	1	1	0	1	1
3D-Cbd	0	0	0	0	1	0	1	1
3X-Crazy	0	0	1	1	1	0	1	1
3Rd-Coast-Panama-Chunk	0	1	0	0	0	0	1	1
501St-Og	0	0	0	1	1	0	1	0
5Th-Element	0	0	0	1	1	1	0	1
707-Headband	1	0	0	1	0	0	1	1
8-Ball-Kush	1	0	0	1	1	0	1	1

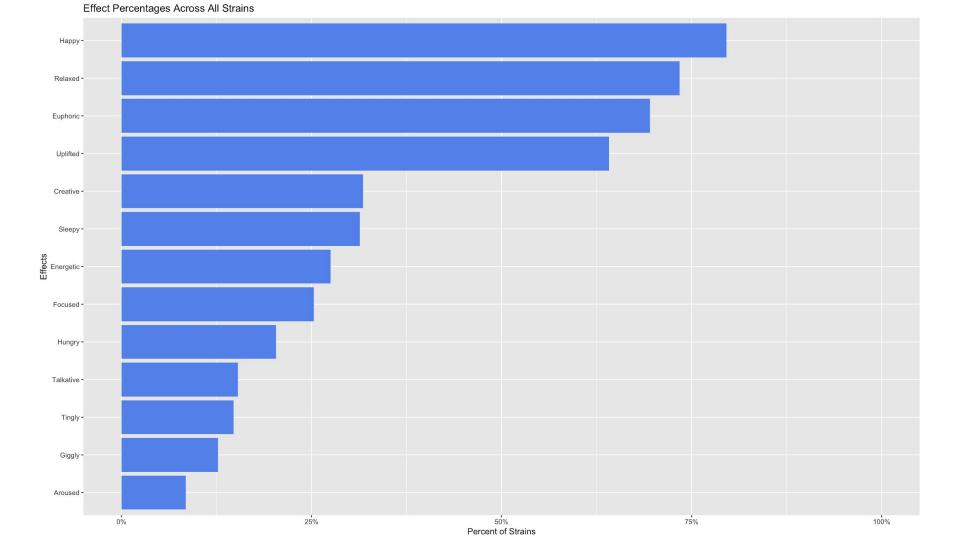
^	Earthy <sup>‡</sup>	Sweet ÷	Citrus	Flowery	Violet <sup>‡</sup>	Diesel	Spicy.Herbal 🗦	Sage <sup>‡</sup>	Woody
100-Og	1	1	1	0	0	0	0	0	0
98-White-Widow	0	0	0	1	1	1	0	0	0
1024	0	0	0	0	0	0	0	1	1
13-Dawgs	0	0	1	0	0	0	0	0	0
24K-Gold	1	0	1	0	0	0	0	0	0
3-Bears-Og	0	0	0	0	0	0	0	0	0
3-Kings	1	1	0	0	0	0	0	0	0
303-Og	1	0	1	0	0	0	0	0	0
3D-Cbd	1	0	0	1	0	0	0	0	1
3X-Crazy	1	1	0	0	0	0	0	0	0
3Rd-Coast-Panama-Chunk	0	0	0	0	0	1	0	0	0
501St-Og	1	0	0	0	0	0	0	0	0
5Th-Element	1	0	0	0	0	0	0	0	1
707-Headband	1	0	0	0	0	0	0	0	1
8-Ball-Kush	1	0	1	0	0	0	0	0	0

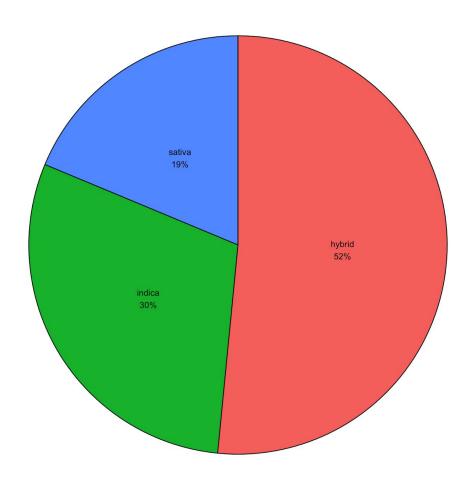
### **Our Guiding Questions**



- How do flavor and effect influence the user rating of a cannabis strain?
- How do strain types (indica, hybrid, sativa) differ in terms of flavor and effect compositions?
- Are there underlying factors within the data? If so, what are they?
- What effects/flavors are associated with highly rated strains?

Flavor Percentages Across All Strains Earthy -Sweet -Citrus -Pungent -Berry -Pine -Flowery -Woody -Diesel -Lemon -Skunk -Tropical -Blueberry -Grape -Orange -Cheese -Pepper -Lime -Strawberry -Pineapple -Minty -Sage -Grapefruit -Lavender -Chemical -Vanilla -Tree -Fruit -Mango -Honey -Ammonia -Nutty -Coffee -Menthol -Butter -Mint -Tea-Rose -Apple -Tobacco -Blue -Apricot -Tar -Violet -Chestnut -Peach -Pear -Plum -Spicy.Herbal -10% 30% 40% 20% 50% 0% Percent of Strains





# Factor Analysis:

 What characteristics of flavor and effect can we represent through factors?

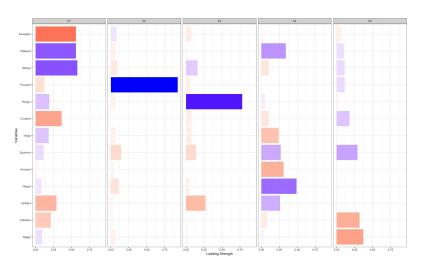


### Factor Analysis (Strain Effects)

Total variance explained: 0.31

Lowest Communality: Tingly/Aroused (0.10)

Highest Communality: Focused (0.89)

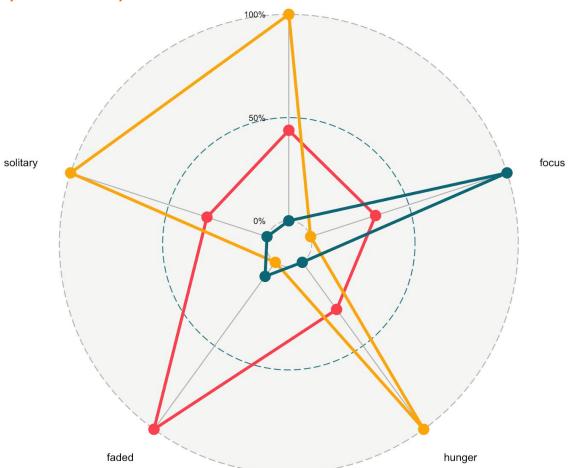


	F1. Relaxing	F2. Focus	F3. Hunger	F4. Faded	F5. Solitary
High Correlations	Relaxed, Sleepy	Focused	Hungry	Happy, Uplifted, Relaxed, Euphoric	Euphoric
Low Correlations	Energetic, Creative, Uplifted	-	Uplifted	Tingly, Aroused	Talkative, Giggly

**Effect Profiles for Hybrid, Indica,** 

**Sativa** 





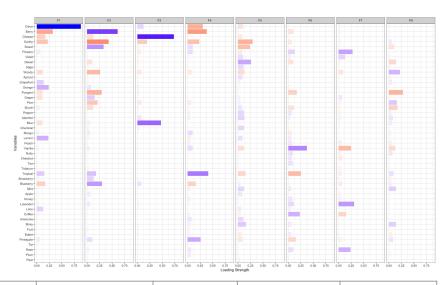
relaxing

### Factor Analysis (Strain Flavors)

Total variance explained: 0.12

Lowest Communality: Fruit (0.10)

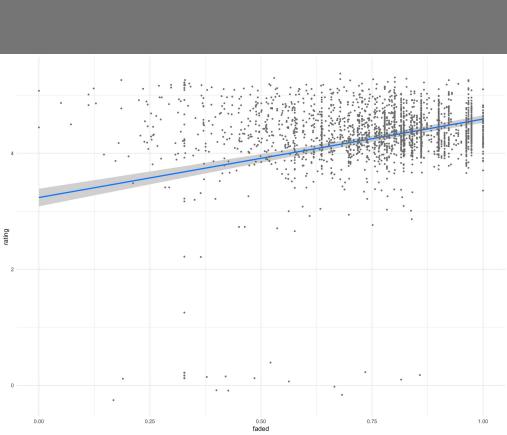
Highest Communality: Citrus (0.89)



	1. Citrus	2. Fruity	3. Cheese	4. Tropical	5. Chemical	6. Coffee	7. Flowery	8. Woody
High Correlations	Citrus, Orange, Lemon, Lime	Berry, Sweet, Blueberry	Cheese, Blue	Tropical, Pineapple	Ammonia, Diesel, Menthol	Vanilla, Coffee	Lavender, Rose, Flowery	Woody, Pine
Low Correlations	Cheese, Earthy	Earthy, Pungent	Earthy	Citrus, Berry	Earthy, Sweet	Tropical	Vanilla	Pungent, Skunk

Flavor Profiles for Hybrid, Indica, citrus **Sativa** fruity woody hybrid indica sativa flowery tropical coffee chemical

### Regression Analysis on Effect and Flavor Factors.



Call: lm(formula = rating ~ factor(type) + relaxing + focus + hunger + faded + solitary + citrus + fruity + cheese + tropical + chemical + coffee + flowery + woody, data = complete) Residuals: Min 10 Median 30 Max -4.3218 -0.2067 0.0367 0.3549 1.8387

2.256 0.02413 \*

2.263 0.02375 \*

#### Coefficients:

citrus

Estimate Std. Error t value Pr(>|t|) (Intercept) 2.89539 0.19305 14.998 < 2e-16 \*\*\* factor(type)indica 0.09398 0.04165

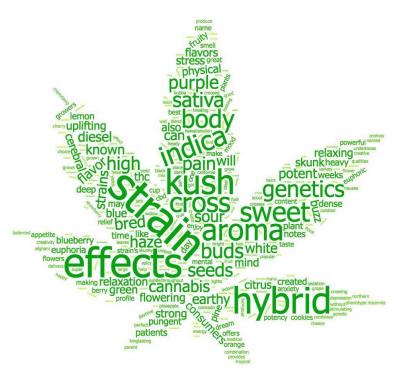
factor(type)sativa 0.04870 0.04603 1.058 0.29014 relaxing 0.09058 0.08113 1.116 0.26432 focus 0.22697 0.04875 4.656 3.40e-06 \*\*\* -0.01702 0.05519 -0.308 0.75787 hunger faded 1.35138 0.09143 14.781 < 2e-16 \*\*\* 0.09158 solitary 0.38613 4.216 2.58e-05 \*\*\* 0.18119

fruity 0.19144 0.08070 2.372 0.01775 \* cheese 0.02368 0.17560 0.135 0.89275 -0.29330 0.11113 -2.639tropical 0.00837 \*\* chemical -0.31528 0.12588 -2.505 0.01233 \* coffee 0.17063 0.25047 -0.19613 -1.149flowery 0.27191 0.23126 1.176 0.23979 woody -0.02868 0.13732 -0.209 0.83461 "\*\*\*, 0.001 "\*\*, 0.01 "\*, 0.02 ", 0.1 ", 1 Signif. codes: Residual standard error: 0.775 on 2334 degrees of freedom Multiple R-squared: 0.1469, Adjusted R-squared: 0.1414

F-statistic: 26.8 on 15 and 2334 DF, p-value: < 2.2e-16

0.08008

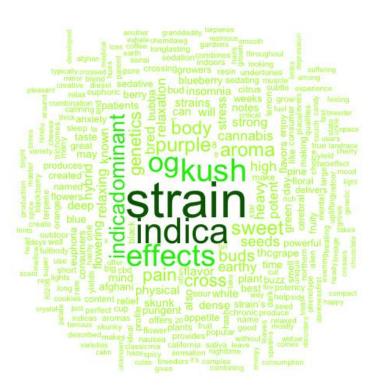
# **Strain Descriptions Summarized** (1)



#### > sample(df\$Description, 1)

[1] "Armageddon sounds pretty intimidating and while this strain is potent, consumers come down from its intense mental lift to find the world still exists—it just feels a little more relaxing. This strain's plants flower quickly at 8 weeks and produce high yields of multi-colored buds that smell strongly of woodsy citrus. The citrus notes carry over into the taste, which is diverse and includes cheese and some fruitiness as well. Armageddon tends to have medium-high to high THC levels, packing a powerful punch for some consumers while others find the initial head effects great for day use and stimulating conversation. Eventually Armageddon mellows into solid body relaxation to finish off its exceptionally long buzz."

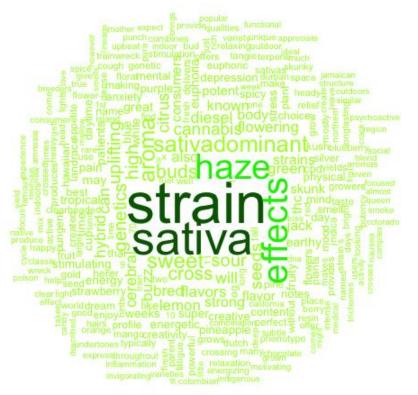
# **Strain Descriptions Summarized** (2)



> sample(df\$Description, 1)

[1] "Tropicali is a newer hybrid on the market. Known to provide an uplifting and cerebral high this strain can also be used for the relief of mild aches and pains. The flowers of the Tc have an alluring frosty mint green color with minimal twists of orange and sticky dewy looking trichomes."

# **Strain Descriptions Summarized** (3)



>sample(df\$Description, 1)

[1] "Although it is a hybrid, the AK-48 high leans more towards typical sativa effects. AK-48's parents are Ice and Jock Horror. Its Ice mother has ancestors of Afghani, Skunk, Northern Lights and Shiva stock."

### **Limitations and Further Analysis:**

- Researchers have argued that strain-type (Sativa/Indica/Hybrid) is not an effective means of explaining a strain's effects. Instead, it would be interesting to examine the chemical breakdown of a strain's cannabinoids (THC v CBD)
- New strains are constantly being added to the Leafly website, so analyzing strains in regards to user rating can be difficult when new strains tend to have <10 ratings</li>
- Leafly allows users to leave lengthy reviews of strains. Finding a way to scrape the website for these reviews could prove interesting in future analysis.