# TEMPORALITY IN ONLINE FOOD RECIPE CONSUMPTION AND PRODUCTION



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## GOAL

**Understanding the hidden temporal dynamics in online food communities** to come up with new models and to improve current recommender mechanisms.

## DATA SET

Our study relies on a dataset obtained from the German **online food community website** kochbar.de; one of the largest of its kind in Europe.

### RESULTS





There are a range of hidden temporal patterns in terms of food preferences and in particular in consumption and production.









*Weekly trends in online food recipe production (contour lines) and consumption (bars).* 

Seasonal trends in online food recipe production (contour line) and consumption (bars).

Users' interests for newly published recipes follow a power law function. We also observe different temporal preference patterns and lifetimes in various recipe categories.



(	(mean+/-	stderr	) nur	nber	of ra	itings	per r	ecipe
1	L6 17	18	19	20	21	22	2 23	3
	spring (360	58)				:		
	without whe	at (3691)	08)					
	lactose-free	(141873	) :					
	gluten free	(230084)	:		· ·	:	:	
	winter (373	64)	<u> </u>				÷	
	summer (47	622) <u>;</u>			: 		÷	
	autumn (38	981)						
	cake / pie (4	1642)	( <b>O</b> )				н :	
		(4049	18)  -  :		-		÷	
)	dairy produ	(5/188)				<b></b>		

**Dataset Statistics:** 400 thousands recipes from years 2010-2014 labeled with 230 categories of 4 classes, 200 thousands users providing 7 milion ratings.



Fitting exponential (dashed line) and power law (continuous line) models to recipes interest (measured with number of ratings) decay. Lifetime (colored bars) and number of ratings per recipe (gray bars) in 20 the most popular categories (number of recipes assigned provided in brackets).

### Method

- We compared food **production and consumption temporal characteristics** in terms of the average values of nutrients.
- Using Spectral Density Estimation we analyzed the most important periods.
  We modeled recipes interest decay with a power law function.

#### FINDINGS

- Seasonal and weekly trends and patterns of nutrients are found (for carbohydrates and calories bursts are observed in November and December, for proteins bursts are more flat and shifted towards late winter and early spring; for proteins short periods dominate whereas for carbohydrates and calories seasonal ones are more prominent).
- There is a gap between what is produced and consumed in terms of nutrients (we observe the preference towards low-fat, low-carbohydrates but high-protein recipes).
  Users' interests for newly published recipes follow a power law function.
- We introduced **recipe lifetime** (the time for which the fitted cumula-tive distribution function of interest is equal to 0.9).
- We quantitatively analyzed lifetime of recipes from **various food categories**.
- There are different temporal **preference patterns in recipe categories** (e.g., spring or gluten-free recipes are more persistent in time than recipes for vegetarians).
- Statistically significant **negative correlation between categories lifetimes and ratings** is observed (more persistent categories earn less attention than these more innovative).

#### REFERENCES

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