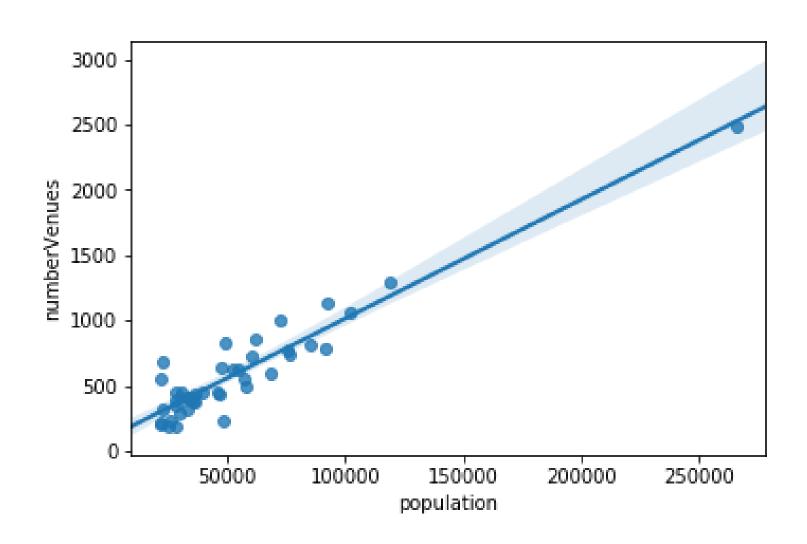
## Identifying Growth Opportunities through Business Population Analysis

An evaluation of cities in Indiana of the United States

## City Venue Count Varies Approximately Linearly with Population



## Several cities are substantially below trend, with far fewer venues than this linear model (including income as well) predicts

city	population	avelncome	numberVenues	predictedVenues	deltaModel
Lawrence	48704	23801	226	544.333339	-318.333339
Fishers	91832	38600	777	1008.452024	-231.452024
Franklin	25089	24471	189	324.063321	-135.063321
Brownsburg	25911	31964	235	360.740251	-125.740251
Kokomo	57836	22102	499	623.955084	-124.955084
East Chicago	28215	13868	192	312.640633	-120.640633
Columbus	47143	29396	435	551.196338	-116.196338
Muncie	68625	16986	593	706.025907	-113.025907
Crown Point	29625	31673	289	394.666321	-105.666321
Greenfield	22094	24458	212	295.749183	-83.749183

This could be a signal of missed opportunity

## Applying the same approach to each category of business we find sectors in various cities that may be ripe for new entrants

minCategory	min	city	
deltaModel Fast Food Restaurant	-15.634305	West Lafayette	
deltaModel Fast Food Restaurant	-14.895415	East Chicago	
deltaModel Fast Food Restaurant	-13.439069	Lawrence	
deltaModel Bar	-12.264502	Fishers	
deltaModel Fast Food Restaurant	-10.268434	Bloomington	
deltaModel Bar	-10.082050	Greenwood	
deltaModel Pizza Place	-8.948254	South Bend	
deltaModel Bar	-8.228488	Elkhart	
deltaModel American Restaurant	-8.190686	Evansville	
deltaModel Pizza Place	-8.050455	Merrillville	

This analysis is limited by the defects in Foursquare data as well as the underlying assumptions of "all things being equal".

This analysis makes the most sense when all venues are equal, which clearly isn't the case.

Revenue data could help ensure venue activity is appropriately weighted.