# STATE OF INDIANA



STATE BUDGET AGENCY 212 State House Indianapolis, Indiana 46204-2796 317-232-5610 Eric J. Holcomb Governor

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# **December 2017 Revenue Forecast**

# Methodology and Technical Documentation

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#### **Introduction**

This document provides an overview of the December 2017 state revenue forecast. The calculation instructions, model specifications, summary statistics, and forecasts are included.

For further information and assistance in the calculation of models, please contact the State Budget Agency's Tax and Revenue Division at 317-232-5610.

#### **Revenue Forecast Committee**

The revenue forecast technical committee is comprised of members from both the executive and legislative branches. Staff from both the State Budget Agency and Legislative Services Agency have a vital role in the process by assisting with data analysis and modeling. Each forecast model and revenue estimate is agreed to by the technical committee on a consensus basis.

#### **Technical Committee:**

Erik Gonzalez, House Democratic Appointee Dr. John Mikesell, Indiana University SPEA Susan Preble, Senate Democratic Appointee David Reynolds, Senate Republican Appointee Ben Tooley, House Republican Appointee Bill Weinmann, State Budget Agency

#### **Budget Committee Appointed Advisors:**

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#### **Key Contributors:**

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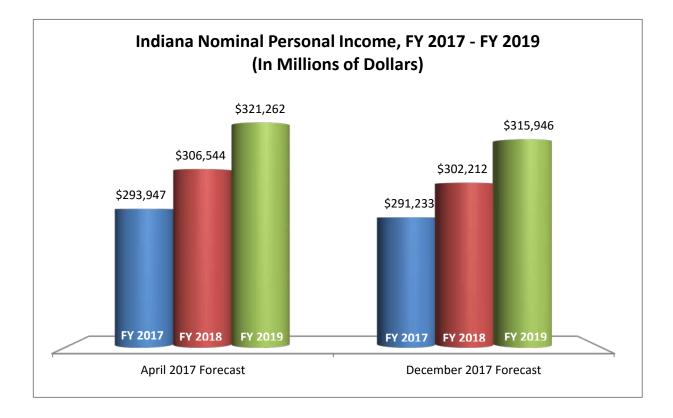
#### Economic Forecast

The forecast committee uses economic forecasts from IHS Markit, Inc. Forecasts cited in this document are provided by IHS, a leading economic consulting firm. IHS is routinely ranked among the leading economic forecasters in studies by The Wall Street Journal and Bloomberg Markets.

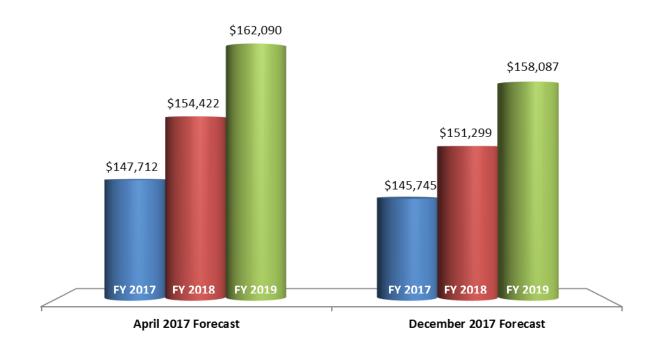
# **Section I: Commentary on the Economic Forecast**

IHS projects U.S. real gross domestic product growth of 2.6% in CY 2018 and 2.3% in CY 2019. Similarly, Indiana real gross state product is forecasted to grow by 2.4% in CY 2018 and 2.1% in CY 2019.

Indiana personal income (net of transfer payments) is a key component of Indiana sales tax revenue. IHS Markit forecasts IPI to grow by 3.8% in FY 2018 and 4.5% in FY 2019.



Indiana wage and salary disbursements are a key determinant of the individual income tax forecast. IHS Markit forecasts this economic indicator to grow by 3.8% in FY 2018 and 4.5% in FY 2019.



Indiana Nominal Wages and Salaries, FY 2017 - FY 2019 (In Millions of Dollars)

The corporate income tax model is IHS Markit's forecast of U.S. corporate profits and Indiana manufacturing employment. Corporate profits, which increased by 4.1% in FY 2017, are forecasted by IHS Markit to grow by 6.1% in FY 2018 and 8.3% in FY 2019. Indiana manufacturing employment which grew by 1.1% in FY 2017, is projected to increase in FY 2018 by 1.7%, then grow by 1.8% in FY 2018.

# Section II: Economic Indicators for Indiana

# **Fiscal Year Amounts**

Indiana Economic Indicators	FY 2015	FY 2016	FY 2017	FY 2018 Forecast	FY 2019 Forecast
Personal Income (millions \$)	272,099.76	281,188.84	291,233.19	302,212.42	315,945.59
Transfer Payments (millions \$)	54,081.65	55,184.39	56,861.33	59,265.58	62,413.90
Nominal Wages and Salaries (millions \$)	135,395.32	141,000.03	145,745.29	151,299.39	158,086.85
Employment Manufacturing (thousands)	513.15	520.69	526.31	535.39	545.07
Population > 65 years of age (thousands)	956.78	982.02	1,007.86	1,035.08	1,063.63
Total Housing Starts (thousands)	17.16	18.95	19.52	19.67	22.22
US Economy					
Corporate Profits (billions \$)	2,194.82	2,039.14	2,122.21	2,251.91	2,439.59
Highway Consumption of Gasoline (billions)	178.32	182.21	183.19	183.96	186.61
Average Retail Price of Gasoline (cents \$)	289.88	230.52	234.13	254.44	250.29
S&P 500 Index	2,038.37	2,025.66	2,266.60	2,585.45	2,585.70

# Year-Over-Year Percentage Change

Indiana Economic Indicators	FY 2015	FY 2016	FY 2017	FY 2018 Forecast	FY 2019 Forecast
Personal Income (millions \$)	4.4%	3.3%	3.6%	3.8%	4.5%
Transfer Payments (millions \$)	8.3%	2.0%	3.0%	4.2%	5.3%
Nominal Wages and Salaries (millions \$)	4.7%	4.1%	3.4%	3.8%	4.5%
Employment Manufacturing (thousands)	3.2%	1.5%	1.1%	1.7%	1.8%
Population > 65 years of age (thousands)	2.8%	2.6%	2.6%	2.7%	2.8%
Total Housing Starts (thousands)	0.1%	10.5%	3.0%	0.8%	13.0%
US Economy					
Corporate Profits (billions \$)	6.5%	-7.1%	4.1%	6.1%	8.3%
US Highway Gallon Consumption (billions)	2.3%	2.2%	0.5%	0.4%	1.4%
Retail Price on All Grades of Gasoline (cents \$)	-18.4%	-20.5%	1.6%	8.7%	-1.6%
S&P 500 Index	13.6%	-0.6%	11.9%	14.1%	0.0%

# Section III: Models Used in the Forecast

#### Sales Tax

The sales and use tax model experienced major revisions in 2016. The sales and use tax base was split into two components – gasoline use tax (GUT) base, and sales tax net of the GUT base. To accomplish this split into the two new data bases, first, the gasoline use tax base was developed using the historical series of (known) monthly gasoline use tax revenue, the sales tax rate on gasoline, and monthly taxable gallons of gasoline sold. A quarterly series was used to capture the seasonal effect of gasoline consumption and generate a more accurate sales tax rate on gasoline. The gasoline use tax rate has been subject to monthly changes since the implementation of the gasoline use tax methodology in FY 2015. This methodology differs from the sales tax methodology used for all other taxable purchases. All purchases other than gasoline purchases, have a fixed 7% tax rate applied to the taxable portion of the purchase. Prior to FY 2015, tracing back to FY 1995, , there was a semiannual sales tax rate on gasoline under the prepaid system of gasoline, which allowed for organizations to prepay the amount of gasoline they expected to consume then trueing up the difference at the end of the month. Prior to FY 2001 no data was available to isolate sales tax on gasoline purchases. Therefore, an estimation technique was used to expand the time series in order to offset the amount of gasoline tax collections from all other sales tax by using the Federal Highway 551 report for gallons and determining a ratio to apply to the known gasoline tax collections and proportionally estimating the sales taxable gallons from the non-sales taxable gallons back to FY 1989. The GUT model also controlled for seasonal, quarterly effects through the use of seasonal dummy variables and variables to control for the periods during which legislation changed the methodology for the calculation and collection of gasoline use tax.

The base for sales tax net of GUT was calculated by subtracting the historical series of gasoline use tax revenue from historical series of total sales tax revenue then dividing the result by the prevailing sales tax rate in each period to generate the new historical series for sales tax net of GUT.

Historical sales and use tax collections are also adjusted to account for legislative changes and tax holidays that have altered tax collections over the course of the two time series. Consequently, the same adjustments must be made in the opposite direction to the forecast values in order to maintain consistency in each of the time series.

The reason for developing the two models was to better account for the impact that volatile gasoline prices have on total sales and use tax. For sales tax net of GUT the same model used in the December 2015 was used in the current forecast with one adjustment. Rather than use only Indiana Personal Income, the committee elected to use Indiana adjusted personal income, which is personal income net of transfer payments. This was done to capture the spending base most likely used to consume taxable goods. The other variables used in the model are Indiana population over 65 to control for the blend of goods and services purchased by this population segment versus the total population, and Indiana housing starts to control for other economic conditions such as recessions.

Total Sales Tax Forecast = Gasoline Use Tax + Sales Net of Gasoline Use Tax

# Sales Tax: Sales Net of Gasoline Use Tax

Log (Sales Tax Base) = $\beta_0$ + ( $\beta_1$ * Log (In	iana Adjusted Personal Income)) + ( $\beta_2$ * Log (Indiana Population>65)) +
(β <sub>3</sub> * Log (Indiana Housing Starts))	

#### **Coefficient Statistics:**

	Coefficient	Estimated Coefficient
	β <sub>o</sub>	1.631***
	β1	1.021***
	β2	-0.411***
	β <sub>3</sub>	0.033 **
Model Statistics:		
	Adjusted R <sup>2</sup>	0.996
	F –Statistic	2,126.114***
	Sample Size (n)	29

Historical Revenue Data			
Fiscal Year	Adjusted Revenue (Millions \$)	Growth	
2013	6,289.00	2.3%	
2014	6,426.44	2.2%	
2015	6,714.46	4.5%	
2016	6,842.97	1.9%	
2017	7,158.45	4.6%	

Forecast Revenue Data		
Fiscal Year	Adjusted Revenue (Millions \$)	Growth
2018	7,279.92	1.7%
2019	7,553.26	3.8%

Log (GUT Base) =  $\beta_0$  + ( $\beta_1$  \* US Gas Prices) + ( $\beta_2$  \* US Highway Consumption of Gasoline) + ( $\beta_3$  \* Dummy CY Q1) + ( $\beta_4$  \* Dummy CY Q2) + ( $\beta_5$  \* Dummy CY Q3) + ( $\beta_6$  \* Dummy FY 2015 Q1) + ( $\beta_7$  \* Dummy FY 2015 and on) + ( $\beta_8$  \* Dummy FY 1995 to FY 2015)

#### **Coefficient Statistics:**

coefficient statistics.		
	Coefficient	Estimated Coefficient
	βo	236.909***
	βı	-13.634***
	β2	3.008***
	β₃	-60.950***
	β <sub>4</sub>	1.064
	β <sub>5</sub>	35.696***
	β <sub>6</sub>	-147.770***
	β <sub>7</sub>	32.138**
	β <sub>8</sub>	22.173**
Model Statistics:		
	Adjusted R <sup>2</sup>	0.854
	F –Statistic	84.837***
	Sample Size (n)	116

Historical Revenue Data			
Fiscal Year	Adjusted Revenue (Millions \$)	Growth	
2013	505.73	6.4%	
2014	499.33	-1.3%	
2015	480.64	-3.7%	
2016	379.63	-21.0%	
2017	330.82	-12.7%	

Forecast Revenue Data		
Fiscal YearAdjusted Revenue (Millions \$)Growth		
2018	304.17	-8.1%
2019	284.60	-6.4%

## **Individual Income Tax**

The committee determined that the income tax forecast should be derived using three separate equations to account for differences between income taxes collected through estimated payments, tax withheld from salary and wage disbursements, and income tax return filings. The selected equations use quarterly data rather than fiscal year data to account for fluctuations throughout each fiscal year.

Estimated payments are mainly collected on investment income, sole proprietors' income, and business income. The estimated payments equation used by the committee includes the S&P 500 Index, the previous year's quarterly estimated payments, and a set of binary variables to account for seasonal factors and structural changes in estimated payment activity.

Withholding on income tax is driven mainly by Indiana salary and wage disbursements. Additionally, income tax can be withheld on pension benefits, retirement benefits, and some government transfer payments. New this year, the committee adjusted the base to reflect new Department of Revenue business rules for transferring subchapter S and partnership tax payments on individuals from corporate to individual income tax withholding. These new business rules will become effective in CY 2018.

The settlement amounts include refunds for overpayment and all forms of final remits. The committee used an autoregressive model of one year with seasonal quarterly variables.

Total Income Tax Forecast = Estimated Payments + Withholding + Settlements

Estimated Payments Tax Base =  $\beta_0$  + ( $\beta_1$  \* Year Lag of Estimated Payments) + ( $\beta_2$  \* S&P 500 Index) + ( $\beta_3$  \* Dummy CY Q1) + ( $\beta_4$  \* Dummy CY Q2) + ( $\beta_5$  \* Dummy CY Q3) + ( $\beta_6$  \* Dummy for CY 2008 Q2) + ( $\beta_7$  \* Dummy FY 2009 and after)

#### **Coefficient Statistics:**

	Coefficient	Estimated Coefficient
	βo	-567.282
	β1	0.293***
	β₂	1.270***
	β₃	2,100.783***
	$\beta_4$	3,299.074***
	β₅	1,828.008***
	$\beta_6$	3,132.152***
	β7	-850.073***
Model Statistics:		
	Adjusted R <sup>2</sup>	0.895
	F -Statistic	98.730***
	Sample Size (n)	81

Historical Data		
Fiscal Year	Adjusted Revenue (Millions \$)	Growth
2013	437.11	8.1%
2014	427.16	-2.3%
2015	483.84	13.3%
2016	584.89	20.2%
2017	601.50	2.1%

Forecast Data		
Fiscal YearAdjusted Revenue (Millions \$)Growth		
2018	650.40	8.1%
2019	650.44	0.0%

Log (Withholdings Tax Base) =  $\beta_0$  + ( $\beta_1$ \* Log (Indiana Nominal Wages and Salaries)) + ( $\beta_2$ \* Dummy FY Q3) + ( $\beta_3$ \* Dummy FY Q4) + ( $\beta_4$ \* Dummy FY Q1) + ( $\beta_5$ \* Number of Months Following a Five Friday)

#### **Coefficient Statistics:**

**Model Statistics:** 

Coefficient	Estimated Coefficient
$\beta_0$	-2.514***
$\beta_1$	1.087***
$\beta_2$	0.144***
$\beta_3$	0.086***
$\beta_4$	0.029**
$\beta_5$	0.032***
Adjusted R <sup>2</sup>	0.965
F -Statistic	468.280***
Sample Size (n)	85

Historical Data		
Fiscal Year	Adjusted Revenue (Millions \$)	Growth
2013	4,277.11	1.0%
2014	4,314.27	0.9%
2015	4,470.72	3.6%
2016	4,578.48	2.3%
2017	4,784.23	2.4%

Forecast Data		
Fiscal Year	Adjusted Revenue (Millions \$)	Growth
2018	4,990.8	4.3%
2019	5,222.4	4.6%

## **Corporate Income Tax**

The corporate adjusted gross income ("AGI") model includes a year lag of the fiscal year National Income and Product Accounts (NIPA) corporate profits to account for varying corporate fiscal years and the lagged influence of corporate profits on corporate AGI, Indiana manufacturing employment and a binary variable to control for the structural change to Indiana's corporate tax in FY 2004.

The corporate tax rate is scheduled to gradually decrease until FY 2021. Over the biennium, rates will range from 6.5% in FY 2016 to 5.75% in FY 2019. The corporate tax collections data and forecast are adjusted to account for past legislative changes.

New this year, the committee adjusted the base to reflect new Department of Revenue business rules for transferring subchapter S and partnership tax payments on individuals from corporate to individual income tax withholding. These new business rules will become effective in CY 2018.

In addition to the equation for corporate AGI, revenues from the smaller utility receipts tax, the utility services use tax, and the financial institutions tax were forecast separately using historical averages. These forecasts are then added together to get a total corporate tax forecast.

Corporate Tax Base =  $\beta_0$  + ( $\beta_1$  \* Year Lag of FY US Corporate Profits) + ( $\beta_2$  \* Indiana Manufacturing Employment) + ( $\beta_3$  \* FY 2004 and after)

Coefficient Statistics:		
	Coefficient	Estimated Coefficient
	βo	-6.194.998**
	β1	5.308***
	β2	14.313***
	β₃	-1,306.458*
Model Statistics:		
	Adjusted R <sup>2</sup>	0.845
	F -Statistic	774.323***
	Sample Size (n)	24

Historical Data		
Fiscal Year	Adjusted Revenue (Millions \$)	Growth
2013	676.21	-3.8%
2014	764.74	13.1%
2015	777.78	1.7%
2016	699.19	-10.1%
2017	730.92	4.54%

Forecast Data		
Fiscal Year	Adjusted Revenue (Millions \$)	Growth
2018	520.52	-28.8%
2019	615.70	18.3%

# **Cigarette & Other Tobacco Products Tax**

The committee estimates cigarette tax and tobacco products tax separately. Cigarette sales, measured in packs of 20, depends upon fiscal year real Indiana personal income, an estimate of the sum of the four surrounding states' real prices, the real Indiana price, the real Indiana cigarette excise tax rate, and a trend variable. Other tobacco product sales are estimated based on an annual fiscal year trend.

Log (Packets Sold) =  $\beta_0$  + ( $\beta_1$  \* Log (Real FY Indiana Personal Income)) + ( $\beta_2$  \* Log (Real Indiana Cigarette Price)) + ( $\beta_3$  \* Log (Real All Neighbor's Price)) + ( $\beta_4$  \* Log (Real Indiana Cigarette Tax Rate)) + ( $\beta_5$  \* Trend)

<b>Coefficient Statistics:</b>		
	Coefficient	Estimated Coefficient
	βo	-11.208***
	βı	1.483***
	β <sub>2</sub>	-0.704***
	β <sub>3</sub>	0.846***
	β4	-0.153***
	β₅	-0.056***
Model Statistics:		
	Adjusted R <sup>2</sup>	0.986
	F -Statistic	437.099***
	Sample Size (n)	33

Significance: \*p < 0.1, \*\*p < 0.05, \*\*\*p < 0.01

Historical Data		
Fiscal Year	Adjusted Revenue (Millions \$)	Growth
2013	428.33	1.7%
2014	412.57	-3.7%
2015	404.29	-2.0%
2016	409.50	1.3%
2017	400.00	-2.3%

Forecast Data		
Fiscal Year	Adjusted Revenue (Millions \$)	Growth
2018	379.70	-5.1%
2019	370.80	-2.3%

Note: The state General Fund receives 58.7% of the cigarette and tobacco products taxes. The historical and forecasted revenues reflect cigarette tax (net of collection allowance) to state funds.

## **Alcoholic Beverage Taxes**

The alcoholic beverage tax model includes three equations: one for beer, one for liquor, and one for wine. All three equations include fiscal year real Indiana personal income and the real beverage price. The beer equation includes dummy variables for 1979 and after, 1993 and after, and 2012 and after. The liquor equation includes a dummy variable for 1999 and after. The wine equation includes dummy variables for 1987 and after, and 2012 and after. The sales and income variables are expressed in terms of natural logarithms.

### Alcoholic Beverage Taxes: Beer

Log (Thousands of Gallons of Beer Sold in Indiana) =  $\beta_0$  + ( $\beta_1$ \* Log(FY Real Indiana Personal Income))+ ( $\beta_2$ \* Real Price of Beer in Indiana) + ( $\beta_3$ \* Log(FY Real Indiana Personal Income for FY 1979 and After)) + ( $\beta_4$ \* Log(Real Indiana Personal Income for FY 1979 and After)) + ( $\beta_6$ \* Dummy Variable for FY 1979 and After) + ( $\beta_6$ \* Dummy Variable for FY 1993 and After) + ( $\beta_7$ \* Dummy Variable for FY 2012 and After)

#### **Coefficient Statistics:**

	Coefficient	Estimated Coefficient
	βo	3.070***
	β1	0.749***
	β2	-0.041
	β <sub>3</sub>	-0.760***
	β4	0.255***
	β₅	8.994***
	$\beta_6$	-3.088***
	β7	-0.085***
Model Statistics:		
	Adjusted R <sup>2</sup>	0.980
	F -Statistic	356.690***
	Sample Size (n)	53

Historical Data		
Fiscal Year	Adjusted Revenue (Millions \$)	Growth
2013	4.52	-4.5%
2014	4.55	0.8%
2015	4.66	2.4%
2016	4.80	3.0%
2017	4.71	-1.9%

Forecast Data		
Fiscal Year	Adjusted Revenue (Millions \$)	Growth
2018	4.81	2.1%
2019	4.85	0.8%

# Alcoholic Beverage Taxes: Liquor

Log (Thousands of Gallons of Liquor Sold in Indiana) =  $\beta_0$  + ( $\beta_1$ \* Log (Real Indiana Personal Income)) + ( $\beta_2$ \* Real Price of Liquor in Indiana) + ( $\beta_3$ \* Log (FY Real Indiana Personal Income for FY 1999 and After)) + ( $\beta_4$ \* Dummy Variable for FY 1999 and after)

#### **Coefficient Statistics:**

coefficient otatistics.		
	Coefficient	Estimated Coefficient
	βo	16.671***
	β1	-0.590***
	β2	-0.072***
	β₃	2.249***
	$\beta_4$	-27.256***
Model Statistics:		
	Adjusted R <sup>2</sup>	0.945
	F -Statistic	222.912***
	Sample Size (n)	53

Historical Data		
Fiscal Year	Adjusted Revenue (Millions \$)	Growth
2013	10.26	8.7%
2014	10.35	0.8%
2015	10.59	2.3%
2016	10.89	2.8%
2017	11.40	4.7%

Forecast Data		
Fiscal Year	Adjusted Revenue (Millions \$)	Growth
2018	12.21	7.1%
2019	12.77	4.6%

# Alcoholic Beverage Taxes: Wine

Log (Thousands of Gallons of Wine Sold in Indiana) =  $\beta_0$  + ( $\beta_1$ \* Log (Real Indiana Personal Income)) + ( $\beta_2$ \* Real Price of Wine in Indiana) + ( $\beta_3$ \* Dummy Variable for 1987 and after) + ( $\beta_4$ \* Dummy Variable for 2012 and after)

#### **Coefficient Statistics:**

Coefficient	Estimated Coefficient
βo	1.134
β1	0.865***
β <sub>2</sub>	-0.546***
β₃	-0.285***
B <sub>4</sub>	-0.121

#### **Model Statistics:**

Adjusted R <sup>2</sup>	0.900
F -Statistic	118.442***
Sample Size (n)	53

Historical Data		
Fiscal Year	Adjusted Revenue (Millions \$)	Growth
2013	2.22	-0.3%
2014	2.20	-0.8%
2015	2.25	2.3%
2016	2.31	2.7%
2017	2.41	4.3%

Forecast Data		
Fiscal Year	Adjusted Revenue (Millions \$)	Growth
2018	2.63	9.1%
2019	2.75	4.6%

### **Riverboat and Racino Wagering**

The committee adopted an equation to estimate the total adjusted gross wagering receipts of the state's eleven riverboat casinos and two racinos. Adjusted gross wagering receipts serve as the tax base for both wagering taxes. These estimates are then adjusted to compute the estimated fiscal year riverboat wagering tax collections and racino slot machine wagering tax collections. The equation estimates the quarterly total adjusted gross wagering receipts with nominal Indiana personal income, a set of dummy variables for market and seasonal changes, and an interaction variable that accounts for other economic and market circumstances.

The baseline adjusted gross wagering receipts forecast is then adjusted to account for: (1) potential competitive impacts from new casino operations in neighboring states, (2) changes in Indiana laws, (3) court decisions impacting taxation of gaming revenues and, (4) the competitive effects of a new casino in South Bend Indiana.

Total Adjusted Gross Wagering Receipts =  $\beta_0$ + ( $\beta_1$ \* Indiana Personal Income) + ( $\beta_2$ \* CY Q4 Dummy) + ( $\beta_3$ \* Four Winds Dummy) + ( $\beta_4$ \* Racinos Dummy) + ( $\beta_5$ \* Ohio Dummy) + ( $\beta_6$ \* Indiana Personal Income \* Four Winds Dummy)

Coefficient Statistics:		
	Coefficient	Estimated Coefficient
	βo	-71,762,428
	$\beta_1$	3,498***
	β <sub>2</sub>	-29,664,201***
	$\beta_3$	981,018,616***
	$\beta_4$	73,840,363***
	β₅	-70,209,318***
	$\beta_6$	-4,716***
Model Statistics:		
	Adjusted R <sup>2</sup>	0.909
	F -Statistic	99.199***
	Sample Size (n)	60

# **Riverboat and Racino Wagering**

Riverboat Wagering Historical Data		
Fiscal Year	Adjusted Revenue (Millions \$)	Growth
2013	448.65	-9.6%
2014	363.32	-19.0%
2015	336.22	-7.5%
2016	330.04	-1.8%
2017	317.60	-3.8%

Riverboat Wagering Forecast Data		
Fiscal Year	Adjusted Revenue (Millions \$)	Growth
2018	296.51	-6.6%
2019	269.83	-9.0%

Racino Wagering Historical Data		
Fiscal Year	Adjusted Revenue (Millions \$)	Growth
2013	105.90	-9.9%
2014	110.71	4.5%
2015	110.55	-0.1%
2016	110.89	0.3%
2017	114.03	2.8%

Racino Wagering Forecast Data		
Fiscal Year	Adjusted Revenue (Millions \$)	Growth
2018	115.52	1.3%
2019	108.95	-5.7%

# **Section IV: Technical Explanations**

#### General Note on the Statistical Forecast Methodology

Models from this forecast are estimated using ordinary least squares regression ("OLS"). The OLS equation estimates the relationship between the explanatory variables (x) and the response variable (y). The multiple regression function is described by the equation below:

$$y = \hat{\beta}_0 + \hat{\beta}_1 x_1 + \dots + \hat{\beta}_n x_n$$

In this equation  $\beta_1$  represents the relationship between the explanatory variable  $x_1$  and the response variable y, while  $\beta_0$  equals the point at which the regression line intercepts with the y axis. The models used to estimate the state revenue forecast use this functional form. Certain models use the natural logarithmic form of the explanatory and response variables.

In order to calculate the forecast values of state revenue (y in the equation above) the committee uses forecast values of the explanatory variables (x) from IHS Markit. By substituting the forecast values of x into the equation, a future value of y can be estimated.

#### **Explanations of summary statistics**

Standard summary statistics for each model are included with the model specifications.

The Adjusted  $R^2$  listed in the model summaries describes the total variation in the response variable (y) explained by the explanatory variables (x). An Adjusted  $R^2$  equal to 0.90 means that 90% of the change in the dependent variable was explained by the change in the explanatory variables.

The number of observations, or sample size, used to estimate the model is also listed as "n". Most of the forecast models are based on annual data, meaning that a model with a "n" equal to thirty is using thirty years of data. Certain models are based on quarterly data and in this case the statistic refers to the number of quarters used to estimate the model.

The F-statistic measures the overall statistical significance of the model and allows for an assessment of the probability that the coefficients estimated by the model do not equal zero. The relationship observed in the model is likely representative of reality if the F-statistic is significant.

The p-value measures the significance of the relationship between a particular explanatory variable and the response variable in the model. While the F-statistic and the associated p-value evaluate the entire model simultaneously, the p-values associated with the coefficients examine each relationship independently.