# JooHee Oh

Management Science

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# ACADEMIC POSITION

<b>Postdoctoral Associate</b> MIT Sloan School of Management and Center for Digital Business	2011-Present
EDUCATION	
Marshall School of Business University of Southern California, Los Angeles, CA PhD in Business Administration Advisors: Prof. II-Horn Hann and Prof. Omar El-Sawy Dissertation title: Piracy Propagation of Information Goods: Theory, Meas	2006-2011 surement, and Application
<b>Seoul National University, Graduate School of Economics</b> MA in Economics	2004
<b>Seoul National University, Seoul, Korea</b> BA in Economics, Business Administration, and Consumer Studies <i>Summa cum laude</i>	2002

# **RESEARCH AND TEACHING INTERESTS**

Digital Products Market; Technology enabled Strategy and Policy; Economics of Information Technology

# WORKING PAPERS

- The Attention Economy: Measuring the Value of Free Goods on the Internet, 2012. With Erik Brynjolfsson.
- Demand and Supply- side Dynamics of Piracy Propagation in P2P Networks, 2010. With Il-Horn Hann.
- From Piracy to Business Intelligence: A Functional Data Analysis of P2P Traffic, 2010. With II-Horn Hann and Gareth James.
- The Interplay between Seeders and Pirates in P2P networks: An Empirical Analysis, 2010. With II-Horn Hann.

# PUBLICATION

Erik Bynjolfsson and JooHee Oh, "The Attention Economy: Measuring the Value of Free goods and Services on the Internet", *Proceedings of the 34<sup>th</sup> International Conference on Information Systems*, Orlando, Florida, US (*forthcoming*).

Jae-Young Kim and Joo Hee Oh (2003), "A Scenario Analysis of Korean Pension Portfolio using Vector Auto Regression (VAR) Model", *The Korean Economic Journal*, Vol. 42.

# CONFERENCE PRESENTATIONS

- The Attention Economy: Measuring the Value of Free goods on the Internet, *ICIS Annual Meeting*, Dec.16<sup>th</sup>, 2012, Orlando, FL.
- The Attention Economy: Measuring the Value of Free goods on the Internet, *INFORMS Annual Meeting*, Oct.17<sup>th</sup>, 2012, Phoenix, AZ.
- From Piracy to Business Intelligence: Forecasting the Sales of Music Albums, *INFORMS Marketing Science Conference, Boston University,* June 9<sup>th</sup>, 2012, Boston, MA.
- The Attention Economy: Measuring the Value of Free goods on the Internet, *INFORMS Marketing Science Conference, Boston University,* June 7<sup>th</sup>, 2012, Boston, MA.
- The Attention Economy: Measuring the Value of Free goods on the Internet, *NBER Workshop on Economics of Digitization, Stanford University*, February 24<sup>th</sup>, 2012, Palo Alto, CA.
- Piracy Propagation of Information goods in P2P networks, *NBER Workshop on Economics of Digitization*, *Stanford University*, February 24<sup>th</sup>, 2012, Palo Alto, CA.
- Measuring the Value of Free goods on the Internet, *Workshop on Information Systems and Economics* (*WISE*), December 8<sup>th</sup>, 2011, Shanghai, China.
- The Interplay between Seeders and Pirates in P2P networks: An Empirical analysis, *Workshop on Information Systems and Economics (WISE)*, December 11<sup>th</sup>, 2010, St. Louis, MO.
- Demand- and supply-side Dynamics of Piracy Diffusion in P2P networks, *Workshop on Information Systems and Economics (WISE)*, December 15<sup>th</sup>, 2009, Phoenix, AZ.
- Forecasting the Sales of Music Albums: A Functional Data Analysis of P2P Traffic, *Southern California Workshop on Information System Research and Development (WISRD), University of California at Irvine*, June 5<sup>th</sup>, 2009, Irvine, CA.
- Forecasting the Sales of Music Albums: A Functional Data Analysis of P2P Traffic, *The Fifth Symposium* on Statistical Challenges in E-Commerce Research (SCECR), The Heinz College, Carnegie Mellon University, May 31<sup>th</sup>, 2009, Pittsburg, PA.
- Forecasting the Sales of Music Albums: A Functional Data Analysis of P2P Traffic, *Internal Seminar*, *University of Southern California*, May 28<sup>th</sup>, 2009, Los Angeles, CA.
- Predicting Music Sales Through Online Word-of-Mouth: A Functional Data Analysis of P2P Traffic, *Schmooze session at R.H. Smith School of Business, University of Maryland*, Dec. 3<sup>rd</sup>, 2008, College Park, MD.
- Forecasting the Sales of Music Albums: A Functional Data Analysis of P2P Traffic, *Workshop on Information Systems and Economics (WISE)*, December 8<sup>th</sup>, 2007, Montreal, Canada.
- Theorizing around the boundaries of strategy and emerging technologies: A Levels of mindfulness framework, Omar A. El Sawy, Joseph Clark, Jeremiah Johnson, Joo Hee Oh, Youngki Park, *JSIS Workshop*, Dec. 9<sup>th</sup>, 2007, Montreal, Canada.

# TEACHING EXPERIENCES

Instructor

IOM402- Business Information Systems: Database Applications, USC, Summer 2010 (Instructor Rating: 4.57/5, Course Rating: 4.43/5)

**Teaching Assistant** 

Graduate Level Course (MBA): Global Businesses and Markets: Strategies Enabled by Technology, USC, Spring 2009

Undergraduate Level Courses: Technology enabled Global Businesses, Markets & Sourcing, USC, Spring 2009 Macroeconomic Principles, UT Austin, Spring 2006 Statistics for Economists, SNU, Fall, 2004 Econometric Methods, SNU, Fall, Spring 2003

#### HONORS AND AWARDS

Doctoral Consortium Fellow, International Conference on Information Systems (ICIS), 2010 Full tuition and stipend, Marshall School of Business, USC, 2006-2010 Graduated Top in the Department, Seoul National University, 2002 Full Tuition Fellowship, Seoul National University, 1997-2002

#### REFERENCES

Erik Brynjolfsson Professor of Management Science Sloan School of Management Massachusetts Institute of Technology Cambridge, MA 02139 Email: <u>erikb@mit.edu</u> Work Phone: (617) 253-4319

Omar El Sawy Professor of Management Marshall School of Business University of Southern California Los Angeles, CA 90089 Email: <u>elsawy@marshall.usc.edu</u> Work Phone: (213) 740-4837

#### WORKING PAPER ABSTRACTS

# Il-Horn Hann

Associate Professor of Information Systems R.H. Smith School of Business University of Maryland College Park, MD 20742-1815 Email: <u>ihann@rhsmith.umd.edu</u> Work Phone: (301) 405-8592

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#### The Attention Economy: Measuring the Value of Free Goods on the Internet

The Internet has given rise to an explosion of free information goods, from Wikipedia articles and Facebook photos to Google maps and YouTube videos. What is their value? Traditional approaches based on measuring prices and quantities do not work well for such goods. In this study, we explore a framework to quantify the value of online applications that have very low prices using the insight that even when people do not pay cash, they must still pay "attention," or time, when consuming information goods. Accordingly, we contrast the value of consumer surplus using two different methods, one based on the value of direct market expenditure, and one based on the value of time spent consuming information goods on the Internet that is not measured in the traditional money-based measure of GDP. Our model of the "attention economy" yields an estimate of annual consumer surplus gain around \$21 billion between 2003 and 2010 created by free sites on the Internet. This corresponds to about 0.17% of average annual GDP during the relating period. Our data imply that less than 7% of total welfare gain would be measured by approaches that rely solely on the variation in direct dollar expenditures. To identify the remaining 93% of value, one must consider time spent on consumption, as we do in this paper.

#### Demand and supply-side Dynamics of Piracy Propagation in P2P network

We study the propagation dynamics of demand and supply-side piracy in a file sharing network. This interplay between the demand and supply-side of piracy directly governs the propagation rate. In this paper, we develop a fluid model that explains piracy propagation in P2P networks for individual songs. We incorporate characteristics of individuals' participation behavior and topological properties of P2P systems in the propagation process. This fluid model leads to a system of non-linear differential equation. We obtain a unique closed-form solution for the differential equation and derive key features of determinants. In the empirical analysis, we perform scenario analyses using estimated parameter values and quantify the impact of demand and supply shock prior to the release on piracy level over time. This model accounts for the supply-side impact of availability on the demand-side of file propagation process that has been spotlighted in current antipiracy efforts. Our results show that the removal of a 1% file supply on release date. The impact of supply on demand level increases over time, however, we found that the effect of demand shock is more significant than supply shock; decrease of a 1% file demand about 6 weeks prior to the release will cut about 1.52% of file demand and 0.24% of file supply on cumulative level afterwards before release date. This result provides anti-piracy policy implications with respect to the effective timing and the importance of demand-control in P2P networks.

#### From Piracy to Business Intelligence: A Functional Data Analysis of P2P traffic

Much attention has been given by the business press and academic work on the relationship between P2P downloading activities and sales of sound recordings (Bhattacharjee et al. 2007; Oberholzer-Gee and Strumpf 2007; Liebowitz 2006). What has garnered less attention is that information on digital piracy offers an opportunity to assess customer preferences to improve business decisions and market forecasting. In this paper, we focus on generating and comparing sales forecasts of music albums utilizing demand and supply side P2P data using a functional data analysis (FDA) approach. Specifically, we relate downloading behavior prior to the official launch date to predict music sales of albums. We find that the characteristics of the functional form of downloading behavior explain first-week sales by 60% after controlling for album characteristics. By updating our forecasts weekly prior to the album release date, we examine the dynamic influences of piracy behavior on sales across heterogeneous albums. The results significantly improve pre-release forecasts of first week sales where the business contribution and embedded uncertainty is the highest. We find that piracy propagation rate convey critical information for pre-release sales prediction.