Contents lists available at ScienceDirect



International Journal of Hospitality Management

journal homepage: www.elsevier.com/locate/ijhm

Discussion paper

Complexity of occupational health in the hospitality industry: Dynamic simulation modeling to advance immigrant worker health



ngninali

Sevil Sönmez^{a,*}, Yorghos Apostolopoulos^{b,c}, Michael Kenneth Lemke^{b,c}, Yu-Chin (Jerrie) Hsieh^d, Waldemar Karwowski^e

^a Rosen College of Hospitality Management, University of Central Florida, Orlando, FL, USA

^b Complexity & Computational Population Health Group, Texas A & M University, College Station, TX, USA

^c Department of Health & Kinesiology, Texas A & M University, College Station, TX, USA

^d Department of Hospitality & Tourism Management, Rochester Institute of Technology, Rochester, New York, USA

^e Department of Industrial Engineering and Management Systems, University of Central Florida, Orlando, FL, USA

ARTICLE INFO

Keywords: Occupational health Immigrant hospitality workers Complex adaptive systems Dynamic simulation modeling

ABSTRACT

Hispanic immigrant workers, who are heavily employed in low-skill/low-wage lodging and foodservice jobs, work in environments that induce disproportionate health and safety risks. Traditional research approaches have produced only partial insights into the risks of Hispanic immigrant hospitality sector workers, failing to fully capture the underlying dynamic, structural, and systemic complexity of hospitality worker health. This paper has three objectives: (1) to outline the multifaceted and disproportionate health and safety risks of these workers; (2) to introduce a systems paradigm with potential to contribute to more promising approaches in occupational health and safety research in tourism and hospitality; and (3) to elaborate on how computational simulation modeling can fortify occupational health and safety research in tourism and hospitality workers rooted in a stakeholder-based system dynamics modeling approach.

1. Introduction

The importance of employee health to the labor-intensive hospitality sector cannot be overstated. Overall injury rates are highest for hotel housekeepers and acute trauma rates are highest in kitchen workers and housekeepers (Buchanan et al., 2010). In addition, turnover rates of the hospitality industry's lodging and restaurant sectors have been increasing over the last several years (56.6% in 2010, 66.7% in 2014, 72.1% in 2015) (Ruggles, 2016). Fortunately, there is growing awareness of the importance of employee health; over 90% of 500 business leaders surveyed believe that promoting wellness can affect employee productivity and performance, as well as employee morale, benefits cost reduction, and safety (HERO, 2015).

Many low-skill/low-wage jobs held by hospitality industry workers require long hours, are physically demanding, pose health and safety risks, and are disproportionally staffed of minorities and immigrants (Lee and Krause, 2002; Marco-Lajara and Úbeda-García, 2013; Sanon, 2014; Watson, 2008; Wial and Rickert, 2002). As the travel and tourism industry experiences continued significant growth, its accommodations sector remains under pressure from increasing competition, high turnover rates, high profits, low-cost productivity, and seasonal demand (Freedman and Kosová, 2014; Marco-Lajara and Úbeda-García, 2013; Watson, 2008). In response to these pressures, the restructuring, consolidation, and other cost-reducing practices of the accommodations sector (e.g., hiring agency workers on H-2B Guest Worker Visas) (Sanon, 2014) have exacerbated the already endemically poor health of its labor force (Freedman and Kosová, 2014; Lee and Krause, 2002), with pronounced consequences for its immigrant and minority workers (Wial and Richert, 2002). Hispanic immigrant workers in particular, who are heavily employed in low-skill jobs in lodging and foodservice, work in environments that induce an array of disproportionate health risks (Brownell, 2008; Hsieh et al., 2013, 2015a,b; Karatepe and Tizabi, 2011; Ross, 2005), as compared to non-immigrant workers in diverse occupations (Loh and Richardson, 2004; Pransky et al., 2002). Due to the significant size of the Hispanic immigrant population in the U.S., its large presence in the accommodation and foodservice sectors, and due to the significant health concerns of this population, the focus of this paper will be on Hispanic immigrants rather than on immigrant

* Corresponding author.

http://dx.doi.org/10.1016/j.ijhm.2017.08.006

E-mail address: sevil.sonmez@ucf.edu (S. Sönmez).

¹ Hospitality sector workers may be used interchangeably throughout this paper with lodging, accommodations, hotel, and foodservice workers.

Received 12 January 2017; Received in revised form 29 April 2017; Accepted 21 August 2017 0278-4319/ © 2017 Elsevier Ltd. All rights reserved.

workers in general. It is important to point out that health, labor, immigration, and economic problems are experienced by a number of different immigrant populations (e.g., Asian, Caribbean, Hispanic, African) to different degrees and require research attention; however, the inclusion of all these populations is beyond the scope and focus of this paper.

Immigrant workers' efforts to adapt to ongoing stressors—precarious employment that carries hazardous exposures, weak bargaining power, low wages, and limited health insurance benefits—exacerbated by depressed living conditions related to immigrant status, have contributed to multisystemic physiological dysregulations and associated comorbidities, including obesity, atherosclerosis, hypertension, and cardiometabolic disorders (Ward et al., 2010; Benach et al., 2010; Davies, 2009).

Traditional research approaches, grounded in linear causality and reductionism, have generated fragmented insights into the work conditions of hospitality sector workers (Marco-Lajara and Úbeda-García, 2013) and health risks of Hispanic immigrant lodging and foodservice workers (Krause et al., 2010; Minkler et al., 2010). This is primarily due to the fact that these studies have examined individual pieces of the problem and overlooked interactions among factors while also ignoring the temporal connections and delayed effects of work policies and conditions. Not only have these traditional approaches failed to fully capture the underlying dynamic and systemic complexity of immigrant hospitality worker health, but also their quantitative analytical techniques have been unable to fully describe health risks and identify efficacious interventions. In contrast, approaches that draw on a synergy of systems (Aldrich, 2008; Lich et al., 2013; Lich et al., 2014; Sturmberg and Martin, 2013), syndemic (Singer, 2009), and socioecological theories (Krieger, 2012), that incorporate sociostructural factors in their etiological models (Belkić, 2000; Karasek, 2008; Siegrist, 1996), and that are grounded in dynamic modeling (Sterman, 2000; Byrne and Callaghan, 2013) can provide a framework to explicate risks of Hispanic immigrant hospitality workers, lead to more effective interventions, and potentially alleviate the burden for hospitality and healthcare sectors (Cook and Rasmussen, 2005).

In this paper we: (1) outline the multifaceted and disproportionate health risks of Hispanic immigrant lodging and foodservice workers; (2) propose a systems paradigm that can contribute to more promising approaches for occupational health and safety research in hospitality; and (3) explain how computational simulation modeling, with an emphasis on system dynamics, can help plow new ground in occupational health and safety research in the hospitality sector. Toward this final objective, a heuristic example is offered of a health risk prevention model among Hispanic immigrant hospitality workers that can emerge from a participatory modeling process.

2. How policy and work organization shape hospitality worker health

In developed countries, health disparities are often rooted in interrelated differences in social status, income, ethnicity, nativity, and geography (Peters et al., 2008). In the U.S., immigrants experience a disproportionate health burden compared to non-immigrants (Edberg et al., 2010; WHO, 2016). Hispanic immigrants in particular are faced with excess levels of overweight/obesity, hypertension, cardiovascular disease (CVD), stroke, and diabetes (Edberg et al., 2010). Pronounced occupational health disparities have also been recorded between immigrant and non-immigrant populations, as immigrants working in risk-laden environments (e.g., construction) have been linked with excess injury and fatality rates (Brunette, 2004; Grzywacz et al., 2012a; Grzywacz et al., 2012b). Hispanic immigrants-often found in temporary, hazardous, and low-skill/low-wage jobs-face excess injury and fatality risk, with rates twice those of non-Hispanics (Benach et al., 2010; Loh and Richardson, 2004). In many countries around the world, immigrant seasonal laborers (e.g., agriculture) often fill "3D jobs"

(dangerous, dirty, degrading) that carry high risk for hazardous exposures, injury, and death (Benach et al., 2010), have difficulty accessing care and compensation when injured, and have weak bargaining power to demand better work conditions (Briggs, 2009; CAPIT, 2014; Community Catalyst, 2009; Davies, 2009; Stimpson et al., 2013; Zallman et al., 2015).

About half of the immigrants in the U.S. work in service or bluecollar occupations (Ahonen et al., 2007), a large proportion of whom are undocumented (Rivera-Batiz, 1999; Ennis et al., 2011). Of all undocumented immigrants, 22% are in professional, business and other services (e.g., landscaping) (NCLR, 2011), 18% work in hospitality sector jobs (BLS, 2016) [sector accounts for over 14.3 million jobs in U.S.], and 16% are in construction (BLS, 2016). In fact, more than half of undocumented immigrants are employed in these three sectors combined, compared with only 31% of native-born U.S. workers (Brown et al., 2007). Adverse work conditions and low-skill requirements of lodging and foodservices in particular tend to overwhelmingly attract vulnerable workers, such as immigrants and minorities. Overall, minorities account for more than 60% of hotel and restaurant workers (NCLR, 2011), and Hispanics are found more often than other ethnic groups in hotel housekeeping and foodservice jobs (25.3% of total employed in the U.S.) (BLS, 2016). Additionally, agency-hired workers on temporary contracts-representing a contingent workforce that has grown to approximately one third of the U.S. workforce-serve as a consistent, economical, and accessible labor pool for the hospitality sector (Sanon, 2014) and are at higher risk for occupational injuries (Buchanan et al., 2010; Virtanen et al., 2005).

Shaped by an array of social, immigration, labor, economic, and health policies, low-wage Hispanic immigrant lodging and foodservice workers live and work in stressogenic and pathogenic environments that generate disproportionate health risk (Benach et al., 2010; Edberg et al., 2010; Schenker, 2010). Compared to other occupations, a sizeable increase in occupational stress has been recorded in the hospitality sector over the past 15-20 years (BLS, 2016; O'Neill and Davis, 2011). Low-paying hospitality sector jobs (e.g., lodging, foodservice) are characterized by unfavorable conditions that not only adversely affect workers' health (Hsieh et al., 2013, 2014, 2015a,b; Karatepe and Tizabi, 2011; Ross, 2005; Pienaar and Willemse, 2008; Wial and Richert, 2002) but present serious challenges for human resource management (Marco-Lajara and Úbeda-García, 2013; Watson, 2008). Hotel workers consistently experience physical (e.g., musculoskeletal injuries); chemical (e.g., exposure to toxic cleaning solutions); biological (e.g., exposure to microbial contaminants); and psychosocial hazards (e.g., long/irregular work hours) (Shani and Pizam, 2009; Willemse, 2006), work stress/time pressures (Chiang et al., 2010; EASHW, 2010; WorkCover, 2003), work-home conflict (Hsieh et al., 2008; Kim, 2008; Wong and Ko, 2009), job insecurity (Gautie, 2010), as well as interpersonal conflict and discrimination (Krause et al., 2010). For foodservice workers, these include: physical (e.g., burns from hot oils); chemical (e.g., carcinogens/mutagens found in fumes when preparing foods under high temperatures); biological (e.g., foodborne organisms); environmental (e.g., slippery floors, environmental tobacco smoke, falls, contusions); and psychosocial hazards (e.g., work stress, discrimination) (Tsai, 2009; Tsai and Salazar, 2007; Woo and Krause, 2003). Entrenched in this context, Hispanic immigrant workers are faced with multisystemic physiological dysregulations or excess allostatic load (AL) accumulation (Salazar et al., 2016). AL is known to contribute to high levels of overweight/obesity (RWJ, 2014), hypertension (AMA, 2013; Sorlie et al., 2014), and hyperlipidaemia (AMA, 2015), as well as cardiovascular (AMA, 2015), and metabolic (Mattei et al., 2010) diseases in this population (AMA, 2013; Khatri et al., 2013; Beckie, 2012; BLS, 2016; Ennis et al., 2011; McClure et al., 2015).

Allostasis is the body's dynamic regulatory process that maintains physiological stability in response to acute stress, whereas *AL* is the cumulative, multisystemic (metabolic, cardiovascular, and immune)

dysregulation resulting from exposure to chronic stress (Sun et al., 2007). *AL* is a summary measure of the physiological "wear and tear" the body experiences from ongoing stress and is further affected by health-damaging behaviors (e.g., diet, lack of exercise, sleep/circadian disruption from shiftwork, alcohol, smoking, social isolation), ultimately resulting in pathology and chronic illness (McEwen, 2004; McEwen and Stellar, 1993; McEwen and Seeman, 2008; Seeman et al., 1997). The longitudinal, nonlinear, and reciprocal nature of *AL* accumulation (Read and Grundy, 2012; Seeman et al., 2010; Wiley et al., 2016) challenges researchers to go beyond traditional methods to not only understand but to mitigate the problem before it manifests in morbidity and mortality.

Immigrant communities characterized by socioeconomic and health disparities are at greater risk for AL accumulation than non-immigrants (Beckie, 2012; Turner, 2016; Turner and Avison, 2003). Because immigrant workers are overrepresented in lower socioeconomic strata (Edberg et al., 2010), they typically find themselves in the lower range of skill and income distributions; are forced to accept undesirable jobs (Schenker, 2010); live in poverty due to inadequate wages (Rivera-Batiz, 1999); face job, housing, and food insecurity (Schenker, 2010); have limited or no access to healthcare; face abuse and exploitation; and experience social exclusion (Benach et al., 2010). Undocumented immigrants, in particular, experience the added fear of deportation risk and separation from family members (Grzywacz et al., 2010; McKanders, 2011). Not surprisingly, documentation status has a major exacerbating effect on all of the foregoing sources of stress. Furthermore, the lack of documentation gives employers and supervisors a means to control, exploit, and intimidate workers into accepting dangerous work conditions (De Castro et al., 2010a,b; Krause et al., 2002) while leaving undocumented workers vulnerable to mistreatment or abuse (Calnan et al., 2004; Poulston, 2008). There is substantial evidence that high-pace and low-skill occupations (Sun et al., 2007), workplace unpredictability, and lack of social and legal protections (McEwen, 2004), together with documentation status are associated with increased risk for AL accumulation and a wide array of farreaching health problems (De Castro et al., 2010a,b; Gamperiene et al., 2006; O'Campo et al., 2004; Sales and Santana, 2003; Zock, 2005).

The collective influence of foregoing multilayered, sociostructural domains—from immigration and labor policies to work and nonwork environments—produce acute and chronic stress over time. Protracted stress and resulting physiological dysregulations have been shown to depress the immune system (Taylor et al., 1997) and offer a valid explanation for how adverse and interacting life and work conditions contribute to excess disease trajectories (Sun et al., 2007; Taylor et al., 1997). When *AL* remains for prolonged periods outside the range of values considered normal, it can lead to the various health problems noted earlier and ultimately to death (Bellingrath et al., 2009).

Along with sociostructural factors, *AL* has been linked with adverse work conditions (Schnorpfeil et al., 2003), stressful work environments (Hansen et al., 2009), and job insecurity (Beckie, 2012) as well as lower decision latitudes, higher job demands (BLS, 2016), greater effort-re-ward imbalance, vital exhaustion, and burnout (Bellingrath et al., 2009). Prolonged exposure to such adverse work conditions can trigger physiological, behavioral, emotional, or cognitive reactions, leading to anxiety, depression, burnout, substance abuse, and other mental health problems (Burgel et al., 2010; Leka and Jain, 2010). Considering the foregoing, it is understandable that Hispanic immigrants employed in low-skill/low-wage lodging and foodservice jobs face multiple *AL* triggers.

Preventive interventions for immigrant worker health have generally overlooked the importance of interacting sociostructural factors (e.g., social, labor, immigration, labor policies) and work organization that have marked the wellbeing of working populations over time including those few designed to advance the health and safety of Hispanic immigrant hospitality workers (Krause et al., 2010; Minkler et al., 2010). Grounded in health education and training, studies with farmworkers (Grzywacz et al., 2013; Quandt et al., 2001; Quandt et al., 2013), poultry workers (Marin et al., 2009), cleaners (Rasmussen et al., 2012), construction workers (Arcury et al., 2012; Brunette, 2005), kitchen workers (Minkler et al., 2010), and hotel room cleaners (Krause et al., 2010) have proposed a variety of low-leverage intervention programs including assessment of job factors, health and safety training for employees and employers, community-based participatory interventions, educational and training materials, as well as testing the efficacy of extant safety interventions. The inadequacy of immigrant worker education alone and the need for greater enforcement of regulations and involvement of policymakers have been acknowledged by only a few (Grzywacz et al., 2013; Quandt et al., 2001, 2013).

3. Systems paradigm in hospitality worker health research

The health risks of Hispanic immigrant hospitality workers can be conceptualized as a complex system comprised of a large number of heterogeneous, interactive, and adaptive components. These factors can be broadly classified under four thematically distinct, multilevel domains: (1) Government and industry policies: immigration, labor, social, and health factors and mechanisms that shape the wellbeing of immigrant lodging and foodservice workers over time (e.g., deportation policies, enforcement of national labor laws, access to social services, affordable healthcare access) (Benach et al., 2010); (2) Work and nonwork environments: intertwined multilayered contexts grounded in work organization and content on the one hand and living conditions and constraints on the other-both shaped by broader public and private/ corporate policies (e.g., precarious working conditions, wage/hours manipulation, depressed neighborhoods, social exclusion) and can regulate population health risks (Brown et al., 2007); (3) Health pathways and embodiment: immediate and time-delayed individual responses to chronically stressogenic environments, such as behavioral (e.g., overeating), physiopathological (e.g., hypertension), and emotional/ psychosocial (e.g., depression) changes and reactions (Sorlie et al., 2014); and (4) Health outcomes: obesity, hypertension, hyperlipidaemia, and related cardiometabolic disorders; mental health issues (e.g., anxiety, depression) (Karatepe and Tizabi, 2011).

In contrast to traditional occupational epidemiology and prevention approaches grounded in reductionism and linear causality, Hispanic immigrant hospitality worker health is characterized by circular causality (in the form of *feedback loops*), where an initial factor ripples through a chain of causation over context, space, and time influencing and being influenced by, several distinct (yet linked) factors (Sterman, 2000). These multilayered and multilevel clusters of factors exhibit bidirectional exchanges (Sterman, 2000; Homer and Hirsch, 2006), where decentralized elements within each cluster influence other elements or systems within and across other clusters over time. These constant feedbacks and complex dynamics result in adaptation and coevolution among included components, where the system self-organizes and produces unpredictable bottom-up outcomes that exhibit emergence. Outcomes are said to emerge from the interactions of factors to produce novel and often-unexpected patterns and properties, which are difficult to predict or accurately understand using linear approaches (Styhre, 2002; Wu et al., 2014).

The following example illustrates the intricacies of reciprocal feedbacks, self-organization, and emergence in *Hispanic immigrant hospitality worker health*: changes in labor policies (e.g., federal government extends minimum wage protections to immigrant workers) would result in perturbations throughout the system of Hispanic immigrant hospitality worker health, and subsequently result in a range of cascading changes, from economic-level consequences, such as employer adaptations (e.g., further pressuring workers to work "off-the-clock") to individual-level consequences, such as worker adaptations (e.g., possible pursuit of unionization). Moreover, the variety of "responses"/ripples resulting from a change in minimum wage protections would consequently lead to additional "feedback" to policymakers, who may have

to create and/or adapt additional legislation in response.

These cyclical causal relationships continue with each change at any level—hence, the term *feedback loops*. Thus, circular action chains continue in perpetuity, or until the system changes via gradual or abrupt shifts, or *phase transitions* (Scheffer, 2009). *Phase transitions, or tipping points*, occur when forces within the system reach a critical threshold; once this happens, the state of the system changes. The susceptibility of a system to phase transitions is contingent upon its *resilience* (or stability) when shocks or disruptions are imposed upon it (Holling, 1973). *Resilience* and *phase transitions* represent critical considerations for efforts to modify systems. Resilient systems may rebuff efforts to intervene, resulting in intervention failures; however, interventions that strategically induce desirable phase transitions can generate exponential, cascading, and sustainable changes throughout a system.

Such architecture contains characteristics of a complex adaptive system (CAS), exemplified by nonlinear (non-proportional), adaptive, and dynamic interactions among its parts, and the generation of selforganizing, non-reductive, unpredictable phenomena (Gatrell, 2005; Miller and Page, 2007). Within this complex adaptive system, individual clusters, elements within various clusters, and smaller or larger subsystems exhibit similar attributes themselves (Sturmberg and Martin, 2013). These characteristics necessitate the conceptualization of immigrant hospitality worker health as a complex adaptive system of systems (CASoS) (Glass et al., 2011). Figs. 1a and 1b present simplified conceptualizations of immigrant hospitality worker health. The contrasting difference between the two diagrams is dynamic complexity. Fig. 1*a* illustrates the socioecological influences on Hispanic immigrant worker health grounded in linear causality, whereas in Fig. 1b it is grounded in circular causality, exemplified by circular causal interactions in the form of feedback loops across contextual and spatiotemporal scales.

These complex, adaptive, and emergent attributes of immigrant hospitality worker health require an ecological and dynamic conceptualization. Current mental, theoretical, and conceptual models in occupational health and safety research are incompatible with the dynamic complexity that characterizes hospitality worker health. For example, extant mental models are often overly narrow regarding the breadth of causal influences and they often underestimate the time horizons across which such problems unfold (Sterman, 2012). Similarly narrow are theoretical and conceptual models, which tend to embody the limited mental models held by the researchers who create them. Conceptual and theoretical models are usually static (Higgins, 2002), in contrast to the temporal dynamics (e.g., adaptation, phase transitions) that underlie dynamic complexity (Miller and Page, 2007). Further, these models are often defined by assumptions of linear cause-and-effect, which contrast non-proportionality (Marshall et al., 2015) and circular causality (Sterman, 2000), which underpin the causal forces within CASoS. Moreover, the prevalent linear and reductionist quantitative methodology and analytical techniques, which seek to maximize internal validity via various forms of observational designs, cannot capture macro-/meso-structural domains and contextual or ecological effects that unfold across different spatiotemporal boundaries. In analytical terms, and based on probability theory and macroscopic laws of averages, the dominant "general linear model" (GLM)² (Abbott, 1988) has guided immigrant hospitality worker health research, as it is the case with social sciences in general. The regression-modeling underpinning analytical approaches grounded in the GLM, however, is fundamentally incapable of handling feedback loops or other nonlinearities (i.e., critical transitions) (Luke and Stamatakis, 2012) where a relatively

small input in the system of immigrant hospitality worker health (e.g., extension of Occupational Safety and Health Administration [OSHA] laws to protect undocumented immigrant workers) can induce disproportionately large effects (e.g., sweeping introduction of safety protections for all workers in the hospitality sector). Even advanced analytical techniques, such as structural equation modeling or latent class analysis, are not designed to capture these nonlinear properties due to the fundamental limitations of the GLM (Galea et al., 2010). Simply put, traditional statistical modeling, or any reductionism-grounded approach, cannot effectively help to identify, model, capture, control, manage or explain *CASoS* (Castellani, 2014), such as immigrant hospitality worker health.

While heavily restricted by the limitations of reductionism and the GLM, immigrant hospitality worker health research has generated important, yet incomplete, insights into occupational safety and health risks, evidenced by modest successes in impacting overall risk burden beyond short periods of time and narrow demographics. Thus, efforts to create sustainable population-wide changes are restricted by inherent shortcomings in the employed science since they are based on a partial understanding of immigrant hospitality worker health and omit complex, dynamic, and emergent sociostructural forces and spatiotemporal scales that exert profound influences in shaping risk burden. These paradigmatic shortcomings have led to incommensurability between epistemology and reality (Kuhn, 2012)-with linear and reductionist assumptions and the true nature of immigrant hospitality worker health being fundamentally different-therefore necessitating a paradigm shift. The introduction and integration of a complex systems paradigm, which represents a new way of thinking with new concepts, theories, and methods in occupational health and safety in the hospitality sector, has the potential to forge new research, policy, and practice directions. Such a paradigm would be grounded in: (a) the synergy of ecosocial (Krieger, 2001), syndemic (Singer, 2009), social ecological (Stokols, 1996), and complex systems (Bar-Yam, 2002; Kernick, 2006; Kremser, 2011) schools of thought; (b) the integration of social, health, natural, and computational sciences; and (c) the advantages of computational simulation modeling.

While this "complexity turn" (Urry, 2005) can make great contributions to theory development, research, and policy in immigrant worker health in general and in hospitality in particular, it is the advent of computational modeling and simulation that can trigger groundbreaking developments-as it has been the case with other social systems (McDaniel and Driebe, 2001; Plsek and Greenhalgh, 2001; Rouse, 2008; Litaker et al., 2006; Paley, 2010). The notion that we cannot truly understand complex social phenomena, such as Hispanic immigrant worker disease burden, until we can reproduce their causes is not new (Epstein, 2006). Modeling and simulating complex systems allows us to grow social structures in silico, demonstrating that certain sets of microspecifications are sufficient to generate macro-phenomena of interest (Epstein, 2006). While we have long referred to the systemic and complex elements of Hispanic immigrant worker health, its effective modeling and eventual delineation has been an elusive endeavor. The investigation of problems that exhibit organized complexity has only recently been made feasible by the proliferation of computational advances (Wilson and Holt, 2001; Wu et al., 2014).

Dynamic simulation modeling methodologies enable us to overcome shortcomings of existing mental, conceptual, and theoretical models, thus allowing us to foresee novel events that these models cannot predict (Chahal et al., 2013; Sterman, 2012; Lane and Husemann, 2008). These approaches explicitly incorporate the aforementioned characteristics and elements of dynamic complexity, providing researchers with the methodological and analytical means to broaden mental models, enrich existing theories, generate new theories, explore novel research questions, and seek limitless possible solutions, all while embracing the CASoS that shape immigrant hospitality worker health. Further, dynamic simulation models can capture vexing nonlinearities by including hypothesized causal factors across multiple levels and

² "The 'general linear model' linearly transforms causality in social systems, and its assumptions—such as assuming entities are fixed and have attributes that are independent of context or history—are fundamentally incompatible with reality of complex social systems" (Abbott, 1988, p. 169), such as immigrant worker health.



Fig. 1. a) Haispanic immigrant worker health grounded in linear causality. b) Hispanic immigrant worker health grounded in circular causality.

spatiotemporal scales, their interrelationships, feedbacks and interactions, and they can provide insights into the emerging aggregate patterns that these systems produce (Sterman, 2012; Faezipour and Ferreira, 2013). In many ways, simulation models are a more flexible structural model form than regression, as they can be tested and fit to data as with regression models. With simulation models, however, the effort is to simulate mechanistically, instead of trying to "control for" background noise and bias to accurately estimate the effect of causal factors. In addition, simulation models go beyond trying to predict or estimate relationships, which are the foci of regression models, and instead are generated to emphasize understanding and especially to inform action. In this way, they provide a framework for assessing, organizing, and synthesizing research across multiple systems (e.g., worker disease distribution) and approaches (e.g., data obtained using different methodologies and analytical techniques). Further, because dynamic modeling and simulation can function as a virtual world, limitless counterfactual scenarios can be tested in controlled experiments (Homer and Hirsch, 2006; Sterman, 2000).

Despite the clear benefits and implications of leveraging dynamic simulation modeling methodologies, research and practice of Hispanic immigrant worker health has not tapped into its potential. Computational modeling has been used in immigrant worker health



Fig. 2. Model of simple stock-and-flow structure in Hispanic immigrant worker health.

research (i.e., Anderson et al., 2007; Zhang and Jager 2011), but it has remained largely underdeveloped, has not been integrated into comprehensive conceptual frameworks and research designs, and remains inadequately grounded in socioecological frameworks. As a result, modeling methodologies have been mechanistic and compartmentalized, instead of being integrated with the epistemology of immigrant worker health research, with these few intriguing but sporadic examples. At the other end of the spectrum, an exhaustive literature search on simulation modeling applications in occupational health and safety research in hospitality brought to light only two conference presentations that initiate an exploratory discussion on the advantages of complex systems in this line of scholarship (i.e., Sönmez et al., 2016; Zhang et al., 2016).

4. Dynamic modeling in hospitality worker health research

There has been a recent explosion in the applications of dynamic simulation modeling in population health and health services research (i.e., Homer and Hirsch, 2006; Milstein et al., 2010), with few applications in occupational health and safety (i.e., Liu et al., 2015). Three such methodologies are well suited for and commonly applied to these types of problems: system dynamics modeling (Sterman, 2000; Homer et al., 2004; Lane and Husemann, 2008), discrete event simulation (Marshall et al., 2015), and agent-based modeling (De Marchi and Page, 2014). They are used to design and develop mathematical representations (i.e., formal models) of the operation of processes and systems to experiment with and test interventions and scenarios and their consequences over time to advance the understanding of the system or process, communicate findings, and inform management and policy design (Marshall et al., 2015).

In the case of occupational health in hospitality sector workplaces, the use of system dynamics (SD) can foster an initial, broad, and aggregate understanding of the underlying causal web of immigrant worker health risks. SD can help to map and model diverse forces of change so that mutual influences on and direction of immigrant hospitality worker health can be better understood and governed. It is very different from traditional approaches in Hispanic immigrant worker health research, as SD: (1) starts from theory, diverse stakeholder input, and available data to assemble visible dynamic hypotheses about the behavior of a system over time in the form of diagrams and models (Sterman, 2000); (2) utilizes the values and insights of community stakeholders (i.e., hotel managers, government policy makers, unions) in a group model-building process (Hovmand, 2014); (3) builds differential-equation-based mathematical models that manifest causal processes, rather than statistical models correlating health risks to outcomes (Sterman, 2000); (4) analyses mathematical models via computer simulations to gain insights into system behavior over time and to formulate insights on gathering supplemental data to test the model with different assumptions (Sterman, 2000); and (5) uses models to design interventions and to gather additional data with the purpose of pursuing realistic model elaborations that pass a variety of verification and validation tests (Lich et al., 2014).

SD models explain causality differently from traditional statistical models, which are based on data fit. In SD, the behavior of a system is predicated on its structure and is not due to external forces. Instead, the emphasis is placed on the endogenous sources of its behavior and the interactions of the factors (variables) inside the model boundary (smallest number of components that define the model's scope and where dynamic behavior is generated as it arises within its internal structure) are believed to generate the observed dynamics (Richardson 2011). System structure is based on the interplay of stocks (accumulation of system elements, e.g., healthy hospitality workers), flows (rates at which quantities are added to or subtracted from stocks over time, e.g., number of workers at risk per year), and auxiliary variables (potential causal factors, e.g., long workhours in hotels) exhibiting direct, indirect, and often circular (rarely proportional to cause) causal relationships (or feedbacks) over time. Simulation, in the form of counterfactual experimentation for the production of optimal results, is used to track stock accumulations, determined by flows, feedbacks, and time delays. Fig. 2 presents a simple stock-and-flow structure in immigrant hospitality worker health, using AL onset and accumulation as an example associated with the excessively stressogenic environment these workers are exposed to.

The structure of Hispanic immigrant hospitality worker health is defined by its feedback structure where hypothesized causal factors are connected by arrows, with annotations about polarities and time delays (Sterman, 2000). When a path originates at any factor, traces from arrow to arrow, and returns to the original factor, it forms a *feedback loop* (Sterman, 2000). Feedback loops can reinforce or oppose initial change in the revisited factor, with the former driving exponential growth and the latter bringing the system toward equilibrium (Sterman, 2000). They determine the behavior of a complex system, as key causal influences are embodied by dominant feedback loops (Sterman, 2000).

Fig. 3 presents a simple feedback structure in Hispanic immigrant hospitality worker health. A reinforcing loop (R) illustrates how labor pool forces can exacerbate psychosocial stress and induce AL onset, where increased AL onset leads to increased cardiovascular disease problems, which in turn triggers workforce attrition. Accelerated workforce attrition generates labor pool shortages that in turn, increase work demands-including a faster pace of work-on the existing labor pool, which then exacerbates psychosocial stress and AL onset. In contrast, a balancing loop (B) demonstrates how employer policies can control AL onset ramifications. As AL onset reduces workforce productivity, this is met with an increase in employer-initiated protections, which then reduce psychosocial stress and trigger AL onset. The trajectory of Hispanic immigrant worker disease burden can change dramatically based on which feedback loop becomes dominant at critical time periods. Since system behavior is predicated on the number, types, and strength of feedbacks loops, these can be seen as fighting for system control, with dominant loops determining the direction of a complex system. In this case, the goal is to leverage those feedback loops that either maintain a particular state or precipitate a change to an



International Journal of Hospitality Management 67 (2017) 95-105

Fig. 3. Example of a model of simple stock-and-flow structure in Hispanic immigrant worker health.

1. Factors at the arrow tail are assumed to causally influence factors at the arrow head

Polarities indicate direction of causal influence. Positive polarities indicate influence in the same direction, and negative polarities indicate influence in the opposite direction

improved and stable state of population wellbeing.

Fig. 4 presents a simplified SD stock-and-flow diagram of Hispanic immigrant worker health. It demonstrates how a SD model can help researchers overcome the limitations in their current mental models and assist in deconstructing the problem at hand and ultimately evaluating different policies. This small model is an example of what may emerge from an actual community-grounded model-building process. An actual model would have significantly greater detail and complexity, and as all models include uncertain assumptions, *uncertainty and sensitivity analyses* would be conducted to assess robustness of its conclusions (Sterman, 2000). Given this is a heuristic example for illustration purposes; only four factors among key potential factors influencing Hispanic immigrant worker health have been selected.

Fig. 4 presents a causal chain of stocks (rectangular boxes), flows (arrows with valves), and auxiliary variables forming *feedback loops B1*, *B2*, *B3*, and *B4*. These feedback loops illustrate how cascading outcomes may affect the health of the Hispanic hospitality immigrant workforce,

which in turn, will necessitate policies protecting Hispanic immigrant workers. Hypothetical examples might include enhanced OSHA enforcement, extension of the Affordable Care Act, implementation of a living wage, and increased access to social services-all of which have potential to curb immigrant worker health risk burden. The uppercentral section of this model-connecting factors (regular font) with bold arrows-represents the current state of Hispanic immigrant worker health and, at the same time, the emerging dynamic hypothesis denoting that interacting labor, health, social, and immigration factors shape and perpetuate risk for AL onset among Hispanic immigrant workers. The upper-outer section of the model-connecting factors (italics) with dashed arrows-represents a preventive scenario that explains how interacting policies, organizational responses, and their aggregate capacity may prevent or reduce AL onset among Hispanic immigrant hospitality workers. Simply put, these domains function as pathways for moving the system into a more positive direction. The simulation and comparison of "what-if" counterfactuals will aid in navigating policy



1. Balancing loop B1 ("Labor Policies") illustrates how government enforcement of safety and health regulations can reduce adverse working conditions, which then reduces both chronic stress and allostatic load (AL) onset.

Balancing loop B2 ("Health Policies") demonstrates how existing federal healthcare legislation can increase healthcare access, in turn reducing chronic stress and AL onset.
 Balancing loop B3 ("Social Policies") exemplify how policies that ensure a living wage can increase the food security of immigrant hospitality workers, which then reduces chronic stress, thereby

reducing AL onset

4. Balancing loop B4 ("Immigration Policies") shows how policies that increase access to social services can reduce social exclusion, which then reduces both chronic stress and AL onset.

Fig. 4. Model of simple stock-and-flow structure in Hispanic immigrant worker health.

configurations needed to trigger the most plausible responses, such as reduction of immigrant hospitality worker disease burden.

5. Conclusion

The wellbeing of the U.S. Hispanic immigrant workforce has widereaching repercussions for the welfare of the hospitality industry. The industry's growing attention to corporate social responsibility (CSR) (Holcomb et al., 2007; Krambia-Kapardis and Neophytidou, 2014) is focused mostly on charitable donations, environmental protection (Pérez et al., 2013), employee job satisfaction and wellbeing, organizational trust (Lee et al., 2013), and quality-of-life of local communities (Bohdanowicz and Zientara, 2009), and rarely on the occupational health of workers on whom it relies so heavily. Although the health of the labor force is linked to the economic health and sustainability of individual enterprises as well as the industry as a whole, when "health" or human resources are mentioned in CSR literature, it is economic health or employee attitudes that are the primary focus (Lynn, 2009).

Moving beyond the hospitality industry, as national health spending continues to soar, there exists a growing interest in workplace disease prevention and wellness programs to improve worker health and lower costs (Baicker et al., 2010; HERO, 2015). In fact, recent studies indicate that high-performing and well-managed companies invest in workforce health and wellbeing (Grossmeier et al., 2016). A meta-analysis of costs and savings associated with workplace wellness programs found that medical costs fall by about \$3.27 per every dollar spent on wellness programs and that absenteeism costs are reduced by \$2.73 for every dollar spent (Baicker et al., 2010). An evaluation of Johnson & Johnson Family of Companies' health promotion programs, revealed that the annual growth in total medical spending was lower than similar large companies and that employees saw reductions in obesity, blood pressure, cholesterol, tobacco use, physical inactivity, and poor nutrition (Henke et al., 2011). Further, Johnson & Johnson saved \$565 in average annual expenditures per employee and produced a return on investment equal to a range of \$1.88-\$3.92 saved for every dollar spent on the program (Henke et al., 2011). Such significant returns on investment denote that the wider implementation of these programs can have large benefits for budgets, help to improve productivity, as well as health outcomes (Baicker et al., 2010; Henke et al., 2011). Substantive efforts to improve worker health are long overdue, especially considering the over 14.3 million employed in the U.S. tourism and hospitality industry (BLS, 2016) and the 284 million employed globally in the travel and tourism industry (WTTC, 2016). It is important to note however, that innovative approaches need to be utilized in order to maximize the benefits of efforts so that meaningful change can be affected in the lives of millions of workers.

It is highly advisable for the accommodation and foodservice sector to seriously consider the value of genuine concern for employee health and substantive efforts to assure healthy and equitable workplaces and conditions to gain competitive advantage (Porter, 1985) over those organizations that neglect or exploit their employees. Organizations with employees, who are ill, injured, stressed, burned out, or depressed pay the costs of absenteeism and presenteeism (working ineffectively while sick), as well as high costs of workers' compensation and insurance. By reducing employee turnover, not only can organizations minimize their recruitment, retention, and training costs, they can also create goodwill and an image as an organization that cares about its employees-which is not only better for their bottom line, but worth far more than profits in the traditional sense. Furthermore, by creating a work environment that is more conducive to a healthy workforce (e.g., reduced stress, living wage, reasonable hours and workload), organizations can further reduce costs related to workers' compensation and insurance, as well as absenteeism and presenteeism due to injury or illness while also gaining competitive advantage over those organizations that fail to do so.

interdependence, connectedness, diversity, and adaptation of causal factors generate dynamic complexity, and it is this complexity that necessitates a new paradigm in occupational health and safety research within this sector. If hospitality stakeholders wish to improve the health and wellbeing of immigrant workers, reduce disease burden, and ultimately see a more productive and financially viable workforce, the time is now to embrace innovative approaches. An application of the systems paradigm, grounded in socioecological and complex adaptive systems theories and dynamic modeling epistemology, can foster new directions in Hispanic immigrant worker health research and bring about positive population health and safety impacts. Community-based SD modeling can be used as a strategic tool in the quest for comprehensive understanding and impactful sustainable interventions to curtail the disease burden of Hispanic immigrant workers. Finally, it is our hope that this paper will serve as a catalyst for a long-overdue discourse on the role of a systems epistemology in hospitality scholarship, with anticipated practical benefits for workers, the industry, healthcare, and stakeholder communities.

References

- AMA, 2013. Hispanics/Latinos and Cardiovascular Disease American Heart Association/ American Stroke Association, Statistical Fact Sheet, 2013 Update. (Retrieved from, https://www.heart.org/idc/groups/heart-public/@wcm/@sop/@smd/documents/ downloadable/ucm_319572.pdf on 4/23/17).
- AMA, 2015. Nearly Half of Hispanics with High Cholesterol Don't Realize It. American Heart Association News (Retrieved from). http://news.heart.org/nearly-half-ofhispanics-with-high-cholesterol-dont-realize-it/on 4/29/2017.
- Abbott, A., 1988. Transcending general linear reality. Sociol. Theory 6, 169–186. Ahonen, E.Q., Benavides, F.G., Benach, J., 2007. Immigrant populations, work and
- Holler, E.G., Denavles, F.G., Benavle, J. 2007. Ininingiant populations, work and Health—A systematic literature review. Scand. J. Work Environ. Health 33 (2), 96–104.
- Aldrich, R.M., 2008. From complexity theory to transactionalism: moving occupational science forward in theorizing the complexities of behavior. J. Occup. Sci. 15 (3), 147–156.
- Anderson, J., Chaturvedi, A., Cibulskis, M., 2007. Simulation tools for developing policies for complex systems: modeling the health and safety of refugee communities. Health Care Manage. Sci. 10 (4), 331–339.
- Arcury, T.A., Mills, T., Marin, A.J., Summers, P., Quandt, S.A., Rushing, J., Lang, W., Grzywacz, J.G., 2012. Work safety climate and safety practices among immigrant latino residential construction workers. Am. J. Ind. Med. 55, 736–745.
- BLS, 2016. Foreign-Born Workers: Labor Force Characteristics—2015. Bureau of Labor Statistics(Retrieved 5/3/2016 from http://www.bls.gov/news.release/pdf/forbrn. pdf).
- Baicker, K., Cutler, D., Song, Z., 2010. Workplace wellness programs can generate savings. Health Aff. (Millwood) 29 (2), 304–311.
- Bar-Yam, Y., 2002. General Features of Complex Systems. Encyclopedia of Life Support Systems. EOLSS Publishers, Oxford, UK.

Beckie, T.M., 2012. A systematic review of allostatic load health, and health disparities. Biol. Res. Nurs. 14 (4), 311–346.

- Belkić, K., 2000. The Occupational Stress Index Job Stress Network. (Retrieved from http://www.workhealth.org/OSI%20Index/OSI%20Introduction.html, December 6, 2010).
- Bellingrath, S., Weigl, T., Kudielka, B.M., 2009. Chronic work stress and exhaustion is associated with higher allostatic load in female school teachers. Stress 12 (1), 37–48.
- Benach, J., Muntaner, C., Chung, H., Benavides, F.G., 2010. Immigration, employment relations, and health: developing a research agenda. Am. J. Ind. Med. 53, 338–343.
- relations, and health: developing a research agenda. Am. J. Ind. Med. 53, 338–343. Bohdanowicz, P., Zientara, P., 2009. Hotel companies' contribution to improving the quality of life of local communities and the well-being of their employees. Tour. Hosp. Res. 9 (2), 147–158.
- Briggs, V.M., 2009. The state of U.S. immigration policy: the quandary of economic methodology and the relevance of economic research to know. J. Law Econ. Policy 5 (1), 177–193.
- Brown, L.A., Mott, T.E., Malecki, E.J., 2007. Immigrant profiles of US urban areas and agents of resettlement*. Prof. Geogr. 59 (1), 56–73.
- Brownell, J., 2008. Striking a balance. Marriage Fam. Rev. 28 (1/2), 109–123.
 Brunette, M.J., 2004. Construction safety research in the United States: targeting the hispanic workforce. Ini. Prev. 10, 244–248.
- Brunette, M.J., 2005. Development of educational and training materials on safety and health: targeting hispanic workers in the construction industry? Fam. Community Health 28 (3), 253–266.
- Buchanan, S., Vossenas, P., Krause, N., Moriarty, J., Frumin, E., Shimek, J.A., Punnett, L., 2010. Occupational injury disparities in the U.S. hotel industry. Am. J. Ind. Med. 53 (2), 116–125.
- Burgel, B., White, M., Gillen, M., Krause, N., 2010. Psychosocial work factors and shoulder pain in hotel room cleaners. Am. J. Ind. Med. 53 (7), 743–756.
- Byrne, D., Callaghan, G., 2013. Complexity Theory and the Social Sciences: The State of the Art. Routledge.
- CAPIT, 2014. The Facts on Immigration Today. Center for American Progress,

Within the context of Hispanic immigrant hospitality worker health,

S. Sönmez et al.

Immigration Team, October 2014.

- Calnan, M., Wadsworth, E., May, M., Smith, A., Wainwright, D., 2004. Job strain, effortreward imbalance and stress at work: competing or complementary models? Scand. J. Public Health 32 (2), 84–93.
- Castellani, B., 2014. Focus: Complexity and the Failure of Quantitative Social Science. Discover Society([cited 2016 April 1]. Available from: http://discoversociety.org/ 2014/11/04/focus-complexity-and-the-failure-of-quantitative-social-science/).
- Chahal, K., Eldabi, T., Young, T., 2013. A conceptual framework for hybrid system dynamics and discrete event simulation for healthcare. J. Enterp. Inf. Manage. 26 (1/2), 50–74.
- Chiang, F.F.T., Birtch, T.A., Kwan, H.K., 2010. The moderating roles of job control and work-life balance practices on employee stress in the hotel and catering industry. Int. J. Hosp. Manage. 29 (1), 25–32.
- Community Catalyst, 2009. Health Disparities Policy Recommendations for Inclusion in National Health Care Reform. National Immigration Law Center, National Immigration Forum and Joint Center on Political and Economic Studies(Retrieved 1/
- 15/2016 from http://www.health_disparities_policy_recommendations.pdf). Cook, R., Rasmussen, J., 2005. Going solid: a model of system dynamics and consequences for patient safety. Qual. Saf. Health Care 14 (2), 130–134.
- Davies, I., 2009. Latino immigration and social change in the United States: toward an ethical immigration policy. J. Bus. Eth. 88, 377–391. http://dx.doi.org/10.1007/ s10551-009-0291-x.
- De Castro, A.B., Voss, J.G., Ruppin, A., Dominguez, C.F., Seixas, N.S., 2010a. Stressors among latino day laborers. Am. Assoc. Occup. Health Nurses 58 (5), 185–196.
- De Castro, A.B., Gee, G.C., Takeuchi, D.T., 2010b. Examining alternative measures of social disadvantage among asian americans: the relevance of economic opportunity, subjective social status, and financial strain for health. J. Immigr. Minor. Health 12 (5), 659–671.
- De Marchi, S., Page, S.E., 2014. Agent-based models. Ann. Rev. Polit. Sci. 17, 1-20.
- EASHW, 2010. Managing Psychosocial Risks with Cleaning Workers. European Agency for Safety and Health at Work (EU-OSHA)(Retrieved 3/15/2016 from http://osha. europa.eu/en/publications/e-facts/efact51).
- Edberg, M., Cleary, S., Vyas, A., 2010. A trajectory model for understanding and assessing health disparities in immigrant/refugee communities. J. Immigr. Minor. Health 13 (3), 576–584. http://dx.doi.org/10.1007/s10903-010-9337-5.
- Ennis, S.R., Ríos-Vargas, M., Albert, N.G., 2011. The Hispanic Population: 2010. US Department of Commerce, Economics and Statistics Administration, US Census Bureau.
- Epstein, J.M., 2006. Generative Social Science: Studies in Agent-Based Computational Modeling. Princeton University Press; 2006, Princeton, NJ.
- Faezipour, M., Ferreira, S., 2013. A system dynamics perspective of patient satisfaction in healthcare. Procedia Comput. Sci. 16, 148–156.
- Freedman, M., Kosová, R., 2014. Agency and compensation: evidence from the hotel industry. J. Law Econ. Organ. 30 (1), 72–103.
- Galea, S., Riddle, M., Kaplan, G.A., 2010. Causal thinking and complex system approaches in epidemiology. Int. J. Epidemiol. 39 (1), 97–106.
- Gamperiene, M., Nygård, J.F., Sandanger, I., Waersted, M., Bruusgaard, D., 2006. The impact of psychosocial and organizational working conditions on the mental health of female cleaning personnel in Norway. J. Occup. Med. Toxicol. 1 (1), 1–10.
- Gatrell, A.C., 2005. Complexity theory and geographies of health: a critical assessment. Soc. Sci. Med. 60 (12), 2661–2671.
- Gautie, J., 2010. Low-Wage Work in the Wealthy World. Russell Sage Foundation Publications, New York City.
- Glass, R.J., Ames, A.L., Brown, T.J., Maffitt, S.L., Beyeler, W.E., Finley, P.D., Moore, T.W., Linebarger, J.M., Brodsky, N.S., Verzi, S.J., Outkin, A.V., Zagonel, A.A., 2011. Complex Adaptive Systems of Systems (CASOS) Engineering: Mapping Aspirations to Problem Solutions. (Retrieved on 10/28/2016 from http://www.sandia.gov/ CasosEngineering/assets/documents/ICCS_Mapping_Aspirations_2011-3354.pdf).
- Grossmeier, J., Fabius, R., Flynn, J.P., Noeldner, S.P., Fabius, D., Goetzel, R.Z., Anderson, D.R., 2016. Linking workplace health promotion best practices and organizational financial performance: tracking market performance of companies with highest scores on the HERO scorecard. J. Occup. Environ. Med. 58 (1), 16–23.
- Grzywacz, J.G., Quandt, S.A., Chen, H., Isom, S., Kiang, L., Vallejos, Q., Arcury, T.A., 2010. Depressive symptoms among latino farmworkers across the agricultural season: structural and situational influences. Cultur. Divers. Ethnic Minor. Psychol. 16, 335–343.
- Grzywacz, J.G., Arcury, T.A., Mora, D., Anderson, A., Chen, H., Rosenbaum, D.A., Schulz, M.R., Quandt, S.A., 2012a. Work organization and musculoskeletal health: clinical findings from immigrant latino poultry processing and other manual workers. J. Occup. Environ. Med. 54, 995–1001.
- Grzywacz, J.G., Quandt, S.A., Marín, A., Summers, P., Lang, W., Mills, T., Evia, C., Rushing, J., Donadio, K., Arcury, T.A., 2012b. Occupational injury and work organization among immigrant latino residential construction workers. Am. J. Ind. Med. 55 (8), 698–706.
- Grzywacz, J.G., Arcury, T.A., Talton, J.W., D'Agostino Jr., R.B., Trejo, G., Mirabelli, M.C., Quandt, S.A., 2013. Causes of pesticide safety behavior change in latino farmworker families. Am. J. Health Behav. 37 (4), 449–457.
- HERO, 2015. Exploring the Value Proposition for Workforce Health: Business Leader Attitudes About the Role of Health as a Driver of Productivity and Performance. The Health Enhancement Research Organization (HERO): Health, Productivity, and Performance Study Committee(Retrieved 10/28/2016 from https://www.shrm.org/ ResourcesAndTools/hr-topics/benefits/Documents/HPP-Business-Leader-Survey-Full-Report_FINAL.pdf).
- Hansen, Å.M., Larsen, A.D., Rugulies, R., Garde, A.H., Knudsen, L.E., 2009. A review of the effect of the psychosocial working environment on physiological changes in blood and urine. Basic Clin. Pharmacol. Toxicol. 105 (2), 73–83.

Henke, R.M., Goetzel, R.Z., McHugh, J., Isaac, F., 2011. Recent experience in health promotion at johnson & johnson: lower health spending, strong return on investment. Health Aff. (Millwood) 30 (3), 490–499.

Higgins, J.P., 2002. Nonlinear systems in medicine? Yale J. Biol. Med. 75 (5–6), 247–260. Holcomb, J.L., Upchurch, R.S., Okumus, F., 2007. Corporate social responsibility: what

are top hotel companies reporting? Int. J. Contemp. Hosp. Manage. 19 (6), 461–475. Holling, C.S., 1973. Resilience and stability of ecological systems. Annu. Rev. Ecol. Syst. 4, 1–23.

- Homer, J.B., Hirsch, G.B., 2006. System dynamics modeling for public health: background and opportunities. Am. J. Public Health 96 (3), 452–458.
- Homer, J., Hirsch, G., Minniti, M., Pierson, M., 2004. Models for collaboration: how system dynamics helped a community organize cost-effective care for chronic illness. Syst. Dyn. Rev. 20 (3), 199–222.
- Hovmand, P.S., 2014. Community Based System Dynamics. Springer, New York.
- Hsieh, Y., Kline, S., Pearson, T., 2008. Lodging managers' perceptions of work and personal life balance: balanced or imbalanced? Int. J. Hosp. Tour. Adm. 9 (1), 18–35. Hsieh, Y., Apostolopoulos, Y., Sönmez, S., 2013. World at work: hotel cleaners. Occup.
- Environ. Med. 70 (5), 360–364.
 Hsieh, Y., Apostolopoulos, Y., Hatzudis, K., Sönmez, S., 2014. Occupational exposures and health outcomes among hispanic hotel cleaners. Hisp. Health Care Int. 12, 6–15.
- Hsieh, Y., Apostolopoulos, Y., Sönmez, S., 2015a. Work conditions and the health and wellbeing of hispanic hotel housekeepers. J. Immigr. Minor. Health 18 (3), 568–581. http://dx.doi.org/10.1007/s10903-015-0224-y.
- Hsieh, Y., Apostolopoulos, Y., Hatzudis, K., Sönmez, S., 2015b. Social, occupational, and spatial exposures and mental health disparities of working-class hispanics in the U.S. J. Immigr. Minor. Health. http://dx.doi.org/10.1007/s10903-015-0231-z.
- Karasek, R., 2008. Low social control and physiological deregulation—the stress-disequilibrium theory: towards a new demand-control model. Scand. J. Work Environ. Health S6, 117–135.

Karatepe, O.S., Tizabi, L.Z., 2011. Work-related depression in the hotel industry: a study in the United Arab Emirates. Int. J. Contemp. Hosp. Manage. 23 (5), 608–623.

- Kernick, D., 2006. Wanted—new methodologies for health service research. Is complexity theory the answer? Fam. Pract. 23 (3), 385–390.
- Kim, H.J., 2008. Hotel service providers' emotional labor: the antecedents and effects on burnout. Int. J. Hosp. Manage. 27 (2), 151–161.
- Krambia-Kapardis, M., Neophytidou, C., 2014. In: Corporate Social Responsibility Reporting in the Hotel Industry. June 19th to the 21 st of 2014 Athens. Greece
- Krause, N., Lee, P.T., Scherzer, T., Rugulies, R., Sinnott, P.L., Baker, R.L., 2002. Health and Working Conditions of Hotel Guest Room Attendants in Las Vegas. (Retrieved November 1, 2012, from http://www.lohp.org/docs/pubs/vegasrpt.pdf).
- Krause, N., Rugulies, R., Maslach, C., 2010. Effort-Reward Imbalance at Work and Self-Rated Health of Las Vegas Hotel Room Cleaners. Am. J. Ind. Med. 53 (4), 372–386.
- Kremser, W., 2011. Phases of school health promotion implementation through the lens of complexity theory: lessons learnt from an Austrian case study. Health Promot. Int. 26 (2), 136–147.
- Krieger, N., 2001. Theories for social epidemiology in the 21 st century: an ecosocial perspective? Int. J. Epidemiol. 30 (4), 668–677.
- Krieger, N., 2012. Epidemiology and the People's Health: Theory and Context. Oxford, New York
- Kuhn, T.S., 2012. The Structure of Scientific Revolutions. University of Chicago Press, Chicago, IL.
- Lane, D.C., Husemann, E., 2008. System dynamics mapping of acute patient flows. J. Oper. Res. Soc. 59 (2), 213–224.
- Lee, P.T., Krause, N., 2002. The impact of a worker health study on working conditions. J. Public Health Policy 23 (3), 268–285.
- Lee, C.K., Song, H.J., Lee, H.M., Lee, S., Bernhard, B.J., 2013. The impact of CSR on casino employees' organizational trust, job satisfaction, and customer orientation: an empirical examination of responsible gambling strategies. Int. J. Hosp. Manage. 33, 406–415.
- Leka, S., Jain, A., 2010. Health Impact of Psychosocial Hazards at Work: An Overview. Geneva. World Health Organization(Retrieved 4/15/2016 from http://whqlibdoc. who.int/publications/2010/9789241500272_eng.pdf, February 3, 2011).
- Lich, K.H., Ginexi, E.M., Osgood, N.D., Mabry, P.L., 2013. A call to address complexity in preventions science research. Prev. Sci. 14, 279–289.
- Lich, K.H., Minyard, K., Niles, R., Dave, G., Gillen, E.M., 2014. System dynamics and community health. Methods for Community Public Health Research: Integrated and Engaged Approaches. pp. 129.
- Litaker, D., Tomolo, A., Liberatore, V., Stange, K.C., Aron, D., 2006. Using complexity theory to build interventions that improve health care delivery in primary care. J. Gen. Intern. Med. 21, S30–S34. http://dx.doi.org/10.1111/j.1525-1497.2006. 00360.x.
- Liu, R., Dix-Cooper, L., Hammond, S.K., 2015. Modeling flight attendants' exposure to secondhand smoke in commercial aircraft: historical trends from 1955 to 1989. J. Occup. Environ. Hyg. 12 (3), 145–155.
- Loh, K., Richardson, S., 2004. Foreign-born workers: trends in fatal occupational injuries, 1996–2001. Mon. Labor Rev. 127, 42.
- Luke, D.A., Stamatakis, K.A., 2012. Systems science methods in public health: dynamics, networks, and agents. Annu. Rev. Public Health 33, 357–376.
- Marco-Lajara, B., Úbeda-García, M., 2013. Human resource management approaches in spanish hotels: an introductory analysis. Int. J. Hosp. Manage. 35, 339–347.
- Marin, A., Carrillo, L., Arcury, T.A., Grzywacs, J.G., Coates, M.L., Quandt, S.A., 2009. Ethnographic evaluation of a lay health promoter program to reduce occupational injuries among latino poultry processing workers. Public Health Rep. 124 (S), 36–43.
- Marshall, D.A., Burgos-Liz, L., Ijzerman, M.J., Crown, W., Padula, W.V., Wong, P.K., Osgood, N.D., 2015. Selecting a dynamic simulation modeling method for healthcare delivery Research—Part 2: report of the ISPOR dynamic simulation modeling

emerging good practices task force. Value Health 18 (2), 147-160.

- Mattei, J., Demissie, S., Falcon, L.F., Ordovas, J.M., Tucker, K.L., 2010. Allostatic load is associated with chronic conditions in the Boston puerto rican health study. Soc. Sci. Med. 70 (12), 1988–1996. http://dx.doi.org/10.1016/j.socscimed.2010.02.024.
- McClure, H.H., Snodgrass, J.J., Martinez Jr., C.R., Squires, E.C., Jiménez, R.A., Isiordia, L.E., Eddy, J.M., McDade, T.W., Small, J., 2015. Stress, place, and allostatic load among mexican immigrant farmworkers in oregon. J. Immigr. Minor. Health 17 (5), 1518–1525.
- McDaniel, R.R., Driebe, D.J., 2001. Complexity science and health care management. Adv. Health Care Manage. 2 (S 11), 37.
- McEwen, B.S., Seeman, T.E., 2008. Allostatic load and allostasis. Research Network on Socioeconomic Status and Health. The John D. and Katherine T. MacArthur Foundation(Retrieved 1/23/2016 from http://www.macses.ucsf.edu/research/ allostatic/allostatic.php).
- McEwen, B.S., Stellar, E., 1993. Stress and the Individual: mechanisms leading to disease. Arch. Intern. Med. 153, 2093–2101.

McEwen, B.S., 2004. Protective and damaging effects of the mediators of stress and adaptation: allostasis and allostatic load. In: Schulkin, J. (Ed.), Allostasis, Homeostasis, and the Costs of Physiological Adaptation. Cambridge University Press, Cambridge, pp. 65–98.

- McKanders, K.M., 2011. Unforgiving of Those Who Trespass Against US: State Laws Criminalizing Immigration Status. University of Tennessee Legal Studies Research Paper, pp. 140.
- Miller, J.H., Page, S.E., 2007. Complex Adaptive Systems: An Introduction to Computational Models of Social Life. Princeton University Press.
- Milstein, B., Homer, J., Hirsch, G., 2010. Analyzing national health reform strategies with a dynamic simulation model. Am. J. Public Health 100 (5), 811–819.
- Minkler, M., Lee, P.T., Tom, A., Chang, C., Morales, A., Liu, S.S., Salvatore, A., Baker, R., Chen, F., Bhatia, R., Krause, N., 2010. Using Community-Based Participatory Research to Design and Initiate a Study on Immigrant Worker Health and Safety in

San Francisco's Chinatown Restaurants. Am. J. Ind. Med. 53 (4), 361–371. NCLR, 2011. Building a New Economy: The Price of Luxury. National Council of La Raza (Retrieved 5/3/2016 from http://www.nclr.org/images/uploads/publications/

(Retrieved 3/3/2016 from http://www.http.org/images/uploads/publications/ Employment_Report_July_2011.pdf). O'Campo, P., Eaton, W.W., Muntaner, C., 2004. Labor market experience, work organi-

zation, gender inequalities and health status: results from a prospective analysis of US employed women. Soc. Sci. Med. 58 (3), 585–594.

O'Neill, J.W., Davis, K., 2011. Work stress and well-being in the hotel industry. Int. J. Hosp. Manage. 30 (2), 385–390.

- Pérez, A., Martínez, P., Del Bosque, I.R., 2013. The development of a stakeholder-based scale for measuring corporate social responsibility in the banking industry. Serv. Bus. 7 (3), 459–481.
- Paley, J., 2010. The appropriation of complexity theory in health care. J. Health Serv. Res. Policy 15 (1), 59–61.
- Peters, D.H., Garg, A., Bloom, G., Walker, D.G., Brieger, W.R., Rahman, M.H., 2008. Poverty and access to health care in developing countries. Ann. N. Y. Acad. Sci. 1136 (1), 161–171.
- Pienaar, J., Willemse, S.A., 2008. Burnout, engagement, coping and general health of service employees in the hospitality industry. Tour. Manage. 29, 1053–1063.
- Plsek, P.E., Greenhalgh, T., 2001. The challenge of complexity in health care. Br. Med. J. 323 (7313), 625.

Porter, M., 1985. Competitive Advantage. Free Press, New York.

- Poulston, J., 2008. Metamorphosis in hospitality: a tradition of sexual harassment? Int. J. Hosp. Manage. 27 (2), 232–240.
- Pransky, G., Moshenberg, D., Benjamin, K., Portillo, S., Thackrey, J.L., Hill-Fotouhi, C., 2002. Occupational risks and injuries in non-agricultural immigrant latino workers. Am. J. Ind. Med. 42, 117–123.
- Quandt, S.A., Arcury, T.A., Austin, C.K., Cabrera, L.F., 2001. Preventing occupational exposure to pesticides: using participatory research with latino farmworkers to develop and intervention. J. Immigr. Health 3 (2), 85–96.
- Quandt, S.A., Grzywacz, J.G., Talton, J.W., Trejo, G., Tapia, J., D'Agostino Jr., R.B., Mirabelli, M.C., Arcury, T.A., 2013. Evaluating the effectiveness of a lay health promoter-led, community-based participatory pesticide safety intervention with farmworker families. Health Promot. Pract. 14 (3), 425–432.
- RWJ, 2014. The State of Obesity, Special Report on Racial and Ethnic Disparities in Obesity. Analysis of Obesity Preventon in Latino Communities. Trust for America's Health and Robert Wood Johnson Foundation(Retrieved from http://stateofobesity. org/disparities/on 4/23/2017).
- Rasmussen, C.D.N., Jørgensen, M.B., Carneiro, I.G., Flyvholm, M.A., Olesen, K., Søgaard, K., Holtermann, A., 2012. Participation of danish and immigrant cleaners in a 1-year worksite intervention preventing physical deterioration. Ergonomics 55 (2), 256–264.
- Read, S., Grundy, E., 2012. Allostatic Load: A Challenge to Measure Multisystem Physiological Dysregulation. (National Centre for Research Methods Working Paper, 04/12).
- Richardson, G.P., 2011. Reflections on the foundations of system dynamics. Syst. Dyn. Rev. 27, 219–243.
- Rivera-Batiz, F.L., 1999. Undocumented workers in the labor market: an analysis of the earnings of legal and illegal mexican immigrants in the United States. J. Popul. Econ. 12 (1), 91–116.
- Ross, G.F., 2005. Tourism industry employee work stress—a present and future crisis. J. Travel Tour. Market. 19 (2/3), 133–147.
- Rouse, W.B., 2008. Health care as a complex adaptive system: implications for design and management. Bridge-Wash.-Nat. Acad. Eng. 38 (1), 17.
- Ruggles, R., 2016. Reporter's notebook: hospitality turnover rose to 72.1% in 2015. Nat. Restaur. News 23 (March), 2016. (Retrieved from). http://nrn.com/blog/hospitality-

turnover-rose-721-rate-2015.

- Sönmez, S., Apostolopoulos, Y., Lemke, M., Hsieh, Y.C., 2016. Simulation modeling of occupational health of tourism and hospitality workers. In: Annual Meeting of the Travel and Tourism Research Association. June 14–16, 2016, Vail, CO. Paper 21. . http://scholarworks.umass.edu/ttra/2016/Academic_Papers_Oral/21.
- Salazar, C.R., Strizich, G., Seeman, T.E., Isasi, C.R., Gallo, L.C., Avilés-Santa, L.M., Cai, J., Penedo, F.J., Arguelles, W., Sanders, A.E., Lipton, R.B., Kaplan, R.C., 2016. Nativity differences in allostatic load by age, sex, and Hispanic background from the Hispanic Community Health Study/Study of Latinos. SSM-Popul. Health 2, 416–424.

Sales, E.C., Santana, V.S., 2003. Depressive and anxiety symptoms among housemaids. Am. J. Ind. Med. 44 (6), 685–691.

- Sanon, M.-A.V., 2014. Agency-hired hotel housekeepers: an at-risk group for adverse health outcomes. Workplace Health Saf. 62 (2), 81–85. http://dx.doi.org/10.3928/ 21650799-20140121-07.
- Scheffer, M., 2009. Critical Transitions in Nature and Society. Princeton University Press. Schenker, M.B., 2010. Migration and occupational health: shining a light on the problem. Am. J. Ind. Med. 53, 327–328 (Commentary).
- Schnorpfeil, P., Noll, A., Schulze, R., Ehlert, U., Frey, K., Fischer, J.E., 2003. Allostatic load and work conditions. Soc. Sci. Med. 57, 647–656.
- Seeman, T.E., Singer, B.H., Rowe, J.W., Horwitz, R.I., McEwen, B.S., 1997. Price of adaptation—allostatic load and its health consequences: macArthur studies of successful aging. Arch. Intern. Med. 157 (19), 2259–2268.
- Seeman, T., Gruenewald, T., Karlamangla, A., Sidney, S., Liu, K., McEwen, B., Schwartz, J., 2010. Modeling multisystem biological risk in young adults: the coronary artery risk development in young adults study. Am. J. Hum. Biol. 22, 463–472.
- Shani, A., Pizam, A., 2009. Work-related depression among hotel employees. Cornell Hosp. O. 50 (4), 446–459.
- Siegrist, J., 1996. Adverse health effect of high-effort/low-reward conditions. J. Occup. Health Psychol. 1, 27–41.
- Singer, M., 2009. Introduction to Syndemics: A Critical Systems Approach to Public and Community Health. Jossey-Bass, San Francisco.
- Sorlie, P.D., Allison, M.A., Avilés-Santa, M.L., Cai, J., Daviglus, M.L., Howard, A.G., et al., 2014. Prevalence of hypertension, awareness, treatment, and control in the hispanic community health study/study of latinos. Am. J. Hypertens. 27 (6), 793–800 (hpu003).
- Sterman, J.D., 2000. Business Dynamics: Systems Thinking and Modeling for a Complex World. Irwin/McGraw-Hill, Boston, MA.
- Sterman, J.D., 2012. Sustaining sustainability: creating a systems science in a fragmented academy and polarized world. In: Weinstein, M.P., Turner, R.E. (Eds.), Sustainability Science: The Emerging Paradigm and the Urban Environment. Springer, New York, NY, pp. 21–58.
- Stimpson, J.P., Fernando, A.W., Su, D., 2013. Unauthorized immigrants spend less than other immigrants and U.S. natives on health care. Health Aff. (Millwood) 32 (7), 1313–1318
- Stokols, D., 1996. Translating social ecological theory into guidelines for community health promotion? Am. J. Health Promot. 10 (4), 282–298.
- Sturmberg, J.P., Martin, C. (Eds.), 2013. Handbook of Systems and Complexity in Health. Springer Science & Business Media.
- Styhre, A., 2002. Non-linear change in organizations: organization change management informed by complexity theory. Leadersh. Organ. Dev. J. 23 (6), 343–351.
- Sun, J., Wang, S., Zhang, J.Q., Li, W., 2007. Assessing the cumulative effects of stress: the association between job stress and allostatic load in a large sample of chinese employees. Work Stress 21, 333.
- Taylor, S.E., Repetti, R.L., Seeman, T., 1997. Health psychology: what is an unhealthy environment and how does it get under the skin? Annu. Rev. Psychol. 48, 411.
- Tsai, J.H.C., Salazar, M.K., 2007. Occupational hazards and risks faced by chinese immigrant restaurant workers. Fam. Community Health 30, S71–S79 (2S).
- Tsai, J.H.C., 2009. Chinese immigrant restaurant workers' injury and illness experiences. Arch. Env. Occup. Health 64 (2), 107–114.
- Turner, R.J., Avison, W.R., 2003. Status variations in stress exposure: implications for the interpretation of research on race, socioeconomic status, and gender. J. Health Soc. Behav. 44 (December), 488–505.
- Turner, R.J., 2016. Understanding health disparities: the relevance of the stress process model? Soc. Mental Health 3 (3), 170–186.

Urry, J., 2005. The complexity turn. Theory Cult. Soc. 22 (5), 1-14.

- Virtanen, M., Kivimäki, M., Joensuu, M., Virtanen, P., Elovainio, M., Vahtera, J., 2005. Temporary employment and health: a review. Int. J. Epidemiol. 34, 610–622.
- WHO, 2016. World Conference on Social Determinants of Health: Fact File on Health Inequities. World Health Organization(Retrieved 9/1/2016 from http://www.who. int/sdhconference/background/news/facts/en/).
- WTTC, 2016. Travel & Tourism: Economic Impact 2016 World. World Travel and Tourism Council(Retrieved on 10/23 from http://www.wttc.org/-/media/files/reports/ economic-impact-research/regions-2016/world2016.pdf).
- Ward, J.A., De Castro, A.B., Tsai, J.H.C., Linker, D., Hildahl, L., Miller, M.E., 2010. An injury prevention strategy for teen restaurant workers. Am. Assoc. Occup. Health Nurses J. 58 (2), 57–67.

Watson, S., 2008. Conceptual model for analysing management development in the hospitality industry: a UK perspective. Int. J. Hosp. Manage. 27 (3), 414–425.

- Wial, H., Rickert, J., 2002. U.S. Hotels and Their Workers: Room for Improvement. (Retrieved 3/2/2016 from http://www.hotel-online.com/News/PR2002_3rd/Aug02_ HotelJobs.html).
- Wiley, J.F., Gruenewald, T.L., Karlamangla, A.S., Seeman, T.E., 2016. Modeling multisystem physiological dysregulation. Psychosom. Med. 78 (3), 290–301. http://dx.doi. org/10.1097/PSY.00000000000288 78(3):290-301.
- Willemse, S.A., 2006. Burnout, Coping and Engagement in the Hospitality Industry. (Retrieved 3/6/2016 from http://dspace.nwu.ac.za/bitstream/handle/10394/1285/

S. Sönmez et al.

willemse_sharrona.pdf?sequence = 1).

 Wilson, T., Holt, T., 2001. Complexity and clinical care. Br. Med. J. 323 (7314), 685.
 Wong, S.C., Ko, A., 2009. Exploratory study of understanding hotel employees' perception on work–life balance issues. Int. J. Hosp. Manage. 28 (2), 195–203.

- Woo, S.C., Krause, N., 2003. Working Conditions and Health of Hotel Kitchen Workers In San Francisco. U.S. Bureau of Labor Statistics, San Francisco, CA.
- WorkCover, 2003. Occupational Health and Safety in Hospitality. WorkCover, Government of New South Wales(Retrieved on 10/20/2016 from http://www. workcover.nsw.gov.au/formspublications/publications/Documents/ohs_in_the_ hospitality_industry_4133.pdf).
- Wu, P.L., Yeh, S.S., Woodside, A.G., 2014. Applying complexity theory to deepen service dominant logic: configural analysis of customer experience-and-outcome assessments of professional services for personal transformations? J. Bus. Res. 67 (8), 1647–1670.
- Zallman, L., Wilson, F.A., Stimpson, J.P., Bearse, A., Arsenault, L., Dube, B., Himmelstein, D., Woolhandler, S., 2015. Unauthorized immigrants prolong the life of medicare's trust fund. J. Gen. Intern. Med. 31 (1), 122–127. http://dx.doi.org/10.1007/s11606-015-3418-z.
- Zhang, Q., Jager, W., 2011. Agent-Based Modeling of Population Dynamics in Municipalities: Migration in the Derbyshire & Nottinghamshire Cases in the UK. Report for the EU Prima Project, WP3. University of Groningen, Center for Social

Complexity Studies.

- Zhang, Y., Ricci, P., Bilgihan, A., 2016. Agent-based modeling of destination-Tourist interactive evolution. In: Annual Meeting of the Travel and Tourism Research Association. June 14–16, 2016, Vail, CO.
- Zock, J.P., 2005. World at work: cleaners. Occup. Env. Med. 62 (8), 581-584.

Further reading

- Lingard, H.C., Cooke, T., Blismas, N., Designing for Construction Workers' Occupational Health and Safety: A Case Study of Socio-Material Complexity. Construction Management and Economics, 2012 30(5), 367-382.
- Mitleton-Kelly, E., Complex Systems and Evolutionary Perspectives on Organisations: the Application of Complexity Theory to Organisations, Elsevier Science Ltd. 2003.
- Plsek, P.E., Wilson, T., Complexity, leadership, and management in healthcare organisations Br. Med. J. 2001 323 (7315) 746.
- Plsek, P., Complexity and the adoption of innovation in health care Accelerating Quality Improvement in Health Care-Strategies to Speed the Diffusion of Evidence-Based Innovations Washington, DC, USA, 2003 2005; (Available at: http://www.nihcm.org/plsek.pdf. Accessed September 19, 2005).