# Troubled by Heterogeneity? Control, Infrastructure & Participation in Social Epidemiology & Life Course Development

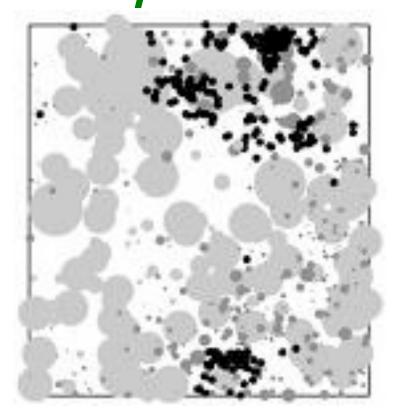
Copies of panels as pdf at <a href="http://bit.ly/TbHFeb14">http://bit.ly/TbHFeb14</a>

## Further discussion welcome--

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# Where do YOU see heterogeneity as an issue in health disparities research and politics?



"It depends on what you mean by heterogeneity..."

OK ->

A. See taxonomy below
B. Read 1+ vignettes
illustrating some of the
heterogeneities listed
C. Discuss w/ author

### Taxonomy of heterogeneities (=complexities to be addressed in theory & practice)

1. There is an <i>assortment</i> , each a separate type ("cabinet of curiosities")
2. Mixture of types (e.g., allelic heterogeneity & locus heterogeneity in genetics)
3. Trait = composite of types (analogy: the 3 components of a triathalon)
4. There is noise or error, but that is deviation from the type or essential trajectory
5. Variation in a set of traits involves a composite of variance/covariance structures
(statistical heterogeneity)
6. There is variation, not types
7. Possibility of underlying heterogeneity: When similar responses of different individual
(e.g., genetic) types are observed, it is not necessarily the case that similar conjunctions
of risk or protective factors have been involved in producing those responses
8. Variation produces <i>qualitative changes in results</i> from standard theory based on uniform
units (e.g., theory about Malthusian population growth, tragedy of the commons,
prisoner's dilemma)
9. Heterogeneity in <i>pathways of development</i> Variants, from Taylor (2005):
9a. Intersecting processesProcesses operating at different spatial and temporal scales
that cut across the boundaries of the situation under consideration and restructure its "internal" dynamics.
9b. Unruly complexityarises whenever there is ongoing change in the structure of
situations that have built up over time from heterogeneous components and are embedded or situated within wider dynamics.
9c. <i>Heterogeneous</i> constructionresearchers establish knowledge and technological
reliability through practices that are developed through diverse and often modest
practical choices. This is the same as saying the researchers are involved in contingent
and ongoing mobilizing of diverse materials, tools, people, and other resources into
webs of interconnected resources.
10. Participatory restructuring of the dynamics (intersecting processes, unruly complexity,
or heterogeneous construction) that generated the data.
11. Transversal engagementParticipatory restructuring through multiple points of
engagement, occurring in tension with deployment or withholding of trans-local knowledge and resources.

# Overview

The two foundational developments of modern biology—theories of evolution by natural selection and genetic basis of heredity—were built from language, arguments, evidence, and practices of *controlled* breeding in agriculture and the laboratory.

-> The relationship between *variation*, *particularity*, or, *heterogeneity* and *control* provides an under-developed angle from which to view modern understandings of heredity and development over the life course and, more generally, in social epidemiology.

### **Guiding contention:**

Research and application of resulting knowledge are untroubled by heterogeneity to the extent that populations are well controlled.

Such control can be established and maintained, however, only with considerable effort or social infrastructure -> invites more attention to possibilities for participation instead of control of human subjects.

This poster = taxonomy of heterogeneities + illustrations, raising issues about addressing or suppressing heterogeneity in social epidemiology and life course development.

### Heterogeneity #1

### An assortment

In an essay on "The Analytical Language of John" Wilkins," Borges (1964) mentions a "doctor Franz Kuhn" referring "to a certain Chinese encyclopaedia entitled 'Celestial Empire of benevolent Knowledge'. In its remote pages it is written that the animals are divided into: (a) belonging to the emperor, (b) embalmed, (c) tame, (d) sucking pigs, (e) sirens, (f) fabulous, (g) stray dogs, (h) included in the present classification, (i) frenzied, (j) innumerable, (k) drawn with a very fine camelhair brush, (I) et cetera, (m) having just broken the water pitcher, (n) that from a long way off look like flies." (http://alamut.com/subj/artiface/language/john Wilkins.html. Michel Foucault brought attention to this passage in Borges in the opening to his The Order of Things.)



### Heterogeneity #2, Mixture of types

Cases: PKU, Rats, Aspirin, CCTV, Genetic & Allelic heterogeneity, Life Events & Difficulties

If the population in question contains a mix of different types that are identified and separable, then identification of a subject's type allows them to be treated or investigated separately and differently.

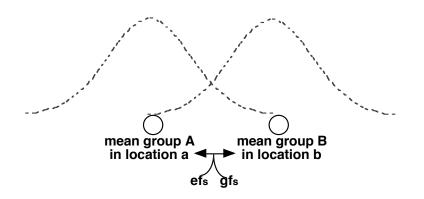
- Phenylketonuria (PKU) is a condition associated with a single genetic locus, but there are different mutations within that locus. People with PKU are a mix of people with different mutations or genetic subtypes.
- "Maternal PKU" arises when a fetus gestates in high-phenylalanine conditions that occur when a PKU mother was not insufficiently compliant with the diet (where compliance may be influenced by a variety of factors; see #9a). If maternal PKU is considered a form of PKU, then the population of children with the deleterious symptoms of PKU is a mix of those with a genetic condition that was not followed by the special diet and those without the genetic condition who have.
- A certain population of light-eyed, yellow rats consisted of two strains, each bred separately from some ancestral founding group. The "two strains of light-eyed, yellow rats, each of which bred true by itself... produced nothing but black-eyed rats when crossed with each other" (Wright 1920, 37). (If each strain had been bred in the same, uniform laboratory conditions, this would seem to be a case of different kinds of genetic factors producing light-eyes for the two strains in those conditions.)

- The protective effect with respect to heart disease and stroke of taking a daily low dose of aspirin differs on average for men and women. This means the human population can be treated as a mix of female and male types with respect to the protective effects of aspirin. However, 9% of the patients in one study appeared "resistant," i.e., their samples didn't show the typical blood-thinning effects of aspirin, meaning that the male and female types are heterogeneous with respect to resistance. In practice, these sub-types are costly to identify and this is rarely done (Eikelboom 2003). Note: It is also possible that the heterogeneous factors underlying the sub-types overlap, that is, the male and female types (which were based on differences on average) can eventually be resolved into a number of types not unique to males or females.
- Evaluations of Closed Circuit television (CCTV) as described by Tilley (2000) might be subject to a meta-analysis. However, such an analysis would mix together studies of situations in which different mechanisms (or a mix of mechanisms) and different contexts apply (as Tilley's list indicate). What meaningful recommendation could emerge form the meta-analysis, even if all results were in the same direction?
- In genetics, homogeneity may be on the surface only, e.g., when it is discovered that different genetic conditions are expressed as the "same" clinical entity. Conversely, the clinical expression of mutations at a single genetic locus can vary significantly from one person to the next (Kaplan 2000, 18). This may be because the mutations are at different points within the locus or because the same genetic condition develops in different genetic and environmental contexts, i.e., the other genetic and environmental factors vary among the people.
- In medical sociology Brown and Harris (1989) often find common meaning among subjects' different types of experience. In other words, Brown and Harris code sameness despite surface heterogeneity.

### Heterogeneity #4, Deviation from the type

### Case: Athletics

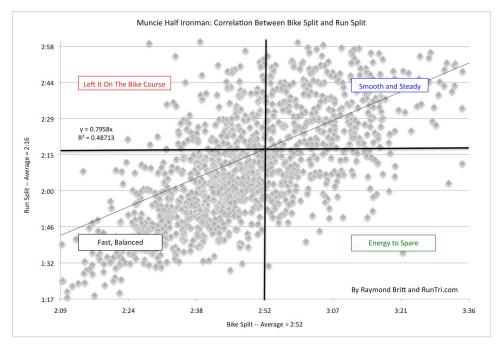
There is noise or error, but that is deviation from the type or essential trajectory



difference in means explained by efs (environmental factors) and gfs (genetic factors)

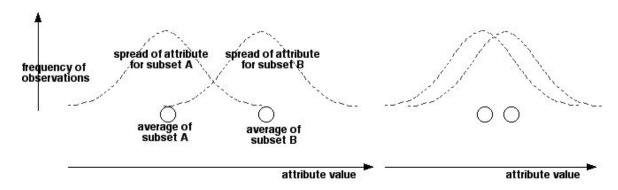
### source:

http://www.runtri.com/201 1/07/muncie-half-ironman-703-results.html



### Heterogeneity #4, Deviation from the type

Statistical analysis rests on a simple kind of heterogeneity, namely, variation around a mean.



- Statistical comparison => you are more likely to doubt that subsets A and B are from the same population in the left hand situation than in the right hand one.
- If you doubt that the subsets are from the same population, investigate further, drawing on other knowledge about the subsets. You hope to expose the causes involved and then take action informed by that knowledge about the cause.
- Variation around a mean is not a strong sense of heterogeneity. The emphasis above is on the means (the circles) more than the variation (the dashed curves). Statistical analysis distinguishes types (or decides they are not distinguishable) more than it explores the variation (or error, i.e., deviation from type).

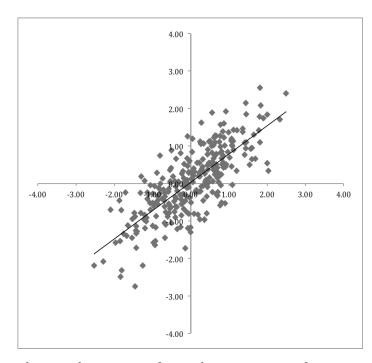
### Heterogeneity #4

### Deviation from the type or essential trajectory

Cases: Correlation, regression

Here the emphasis lies more on prediction than variation, as if, as a generalization of the emphasis in t-tests on types, the line or curve of prediction captured the essential trajectory of the data (McLaughlin 1989). (Everyone knows that correlation is not causation, but most of us interpret regressions in a causal spirit.) An alternative view of correlation and regression keeps our attention on the variation: Correlation is not only the slope of the regression line when the two measurements are scaled to have equal spread. It also measures how tightly the cloud of points is packed around the line of slope 1 (or slope -1 for a ve correlation). When both measurements are scaled to have a standard deviation of 1, the average of the squared perpendicular distance from the points to the line of slope 1 (or -1) is equal to 1 minus the absolute value of the correlation (Weldon 2000). The larger the correlation, the tighter the packing. This tightness-of-packing view of correlation affords no priority to one measurement over the other and that reminds us that additional knowledge always has to be brought

in if the patterns in data are used to support causal claims or hypotheses.



The tightness of packing view of regression for continuous variables can be extended to multivariate associations through Principal Component Analysis, factor analysis, etc.

### Heterogeneity #4, Deviation from the type

### Cases: Dental health, Average Racial IQ test score gap

How do researchers negotiate tension b/w analyses & action based on averages for groups or populations versus attention to variation from those averages & heterogeneous pathways of development?

• Imagine dental health of two communities that have the same range of health problems except that the one with naturally high level of fluorides in its water supply has better than average dental health. In each community there will be variation around the average dental health. However, if the variation is small relative to the differences in the two averages, it might seem reasonable to advocate fluoridation of water supplies lacking natural fluoride. In doing so the variation around the average (a simple form of heterogeneity) is discounted, as are other deviations from type, such as teeth discoloration that occurs in some individuals. Public health policy-makers discount the variation because the benefits exceed the costs when summed up for the community. The policy-makers are able to do this as long as the infrastructure for water-supply fluoridation remains part of public expenditures covered by taxpayers and as long as individuals who bear disproportionate cost (e.g., those who teeth are discolored) do not effectively mobilize resources and allies to resist—in other words, as long as the population is well controlled. Opponents of fluoridation who accept the data on benefits and costs (many opponents do not; Colquhoun 1997) could still promote a participatory alternative: fluoride tablets to be taken by each individual, which would allow people subject to teeth discoloration to adjust the dosage or to choose to manage their dental health without fluoride. This approach is *not* preferred by most public health policymakers, who point to lack of "compliance" when individuals are responsible for administering their own preventative medicines. Participation is seen as unreliable; control is more effective. Population health is the guiding idea; variation within the communities is not troubling (Rose 2008).

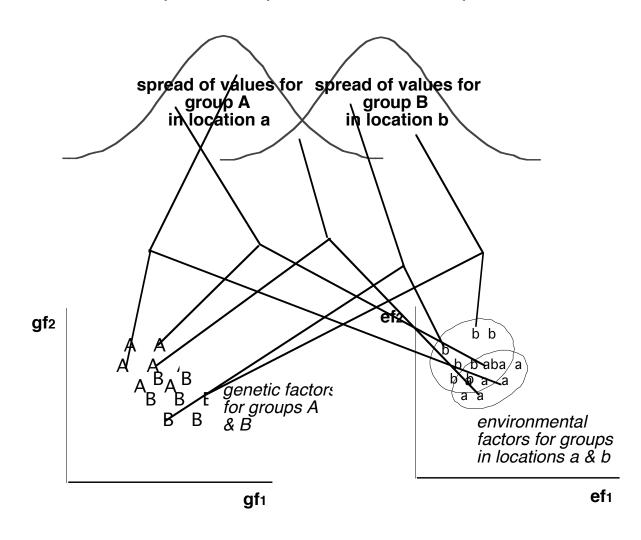
- Suppose two "racial" groups show persistent differences on average in some achievement tests ("racial" groups defined, say, by the U.S. census). By analogy with the fluoride case, we should ascribe the difference to race, i.e., to some social or biological variable(s) that differ from one race to the other. Identifying those variables not as simple as noting the presence or absence of fluoride, but should researchers even try to find them? What if they were to succeed?—If the variable were unalterable (say, a matter of genes), would we resign ourselves to the difference? If the variables were biologically or socially alterable, would we administer the same "antidote" to all in the lower-achieving group? What kind of social infrastructure would be involved in that? (Think here of No Child Left Behind measures mandated in the name of decreasing racial disparities in K-12 test results.)
- Imagine researchers or policy-makers, unhappy with explanations and policies based on group membership, who want to shift the focus to the heterogeneous pathways of development of, in this case, achievement. Given the social context for such a move, these researchers/ policy-makers face troubling conundrums—How can attention be given to diversity of pathways without bolstering the fiction that racial group membership in the U.S. no longer brings social benefits and costs? *And* without providing support for initiatives trying to prohibit collection and use of racially classified information (e.g., the failed 2003 Prop. 54 in California)? At the same time, racial categories used in censuses and other surveys continue to change—as does people's identification with those categories (Hirschman et al. 2000)—yet longituidinal analysis depends on data collected under the same categories for extended time periods. In short, researchers and policy-makers concerned about heterogeneity within and across racial groups have to use data collected under racial categories, and, despite the shifting nature of those categories, get drawn into defending the continued collection of such data lest there be no information and thus no pattern (such as the average IQ test score differences) to push away from (Taylor 2009).

### Heterogeneity #6, There is variation, not types

spread of values for spread of values for group A group B in location b

### Heterogeneity #7, Possibility of "underlying heterogeneity"

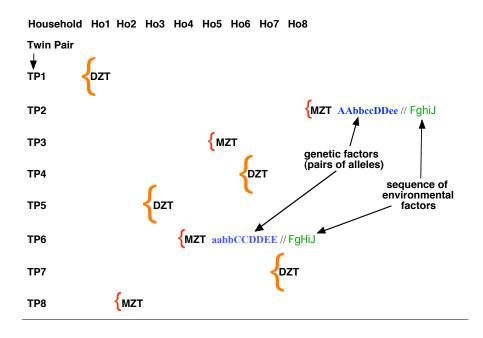
When similar responses of different individual (e.g., genetic) types are observed, it is not necessarily the case that similar conjunctions of risk or protective factors have been involved in producing those responses. The challenge is to expose the factors and the ways they contribute to the response in question, *if that is possible*.



# Heterogeneity #7, Possibility of "underlying heterogeneity" Cases: Heritability, Quantitative genetics

• Studies of heritability of human traits associate similarity among mono- or di-zygotic twins etc. with similarity of (yet-to-be-identified) genes or genetic factors. The data analysis cannot rule out the possibility of factors underlying the development of the trait being heterogeneous = relatives may be similar for a given trait because they share more genes or environmental conditions than less-related individuals, but the genes and environmental conditions underlying the development of the trait need not be the same from one set of relatives to another. Pairs of genetic variants at a number of positions on the genome, say, AAbbccDDee, subject to a sequence of environmental factors, say, FghiJ, could be associated, all other things being equal,

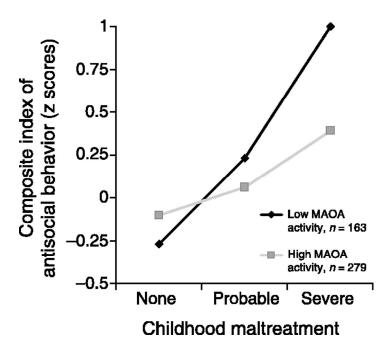
with the same outcome for the trait as are variants aabbCCDDEE subject to a sequence of environmental factors FgHiJ.



• Implication: The common use of heritability as a basis for judging a trait to be a good candidate for molecular research (e.g., Nuffield Council on Bioethics 2002) is not so helpful if underlying factors can be heterogeneous (Taylor 2010).

# Heterogeneity #8, Variation produces qualitative changes in results from standard theory based on populations

Cases: MAOA, gene-environment interaction, personalized medicine



Mean adult composite anti-social behavior score in relation to levels of MonoAmineOxidaseA and Level of Childhood Maltreatment for a sample from Dunedin, New Zealand (Caspi et al. 2002, 852).

Notice that this figure presents the means; around any mean there will be variation. Other figures in the study indicate that some of the high-MAOA individuals end up with higher anti-social behavior scores than some of the low-MAOA individuals. Depending on the threshold, a substantial fraction of the low-MAOA plus severe-maltreatment category does not end up as anti-social adults. Yet, in practice, once the resources were invested to screen children for MAOA levels, the attention of parents, teachers, social workers, and so on would be focused on all low-MAOA children. Indeed, how could treatment on the basis of group membership be avoided if such adults do not know from a childhood MAOA assessment whether any particular individual is one who would go on, after childhood maltreatment, to become an antisocial adult?

Now, some of the parents of low-MAOA children might resist their children being treated according to the mean of the MAOA group. They might also balk at years of prophylatic drug treatment or of maltreatment monitoring by social workers. These parents—together with others concerned about the same

issues—could push for additional research to identify other characteristics that differentiate among low-MAOA children (and perhaps also help predict who among the high-MAOA children are vulnerable). Even if no systematic characteristics were found, it would have been understandable that researchers had sought a more refined account of risk factors than given by the population-level approaches.

If an analogy to the MAOA case holds, the path to personalized medicine would often involve a phase in which large numbers of people are treated according to their group membership. The kinds of medical conditions that would receive the necessary investment in pharmaceutical and sociological research, screening, and preventative treatment or monitoring to address the conjunction of genetic and environmental factors involved would be conditions with a large value for the average benefit of ameliorating the effect of the genetic difference multiplied by number of people considered vulnerable.

For high-average-benefit conditions, if the effect of the genetic difference depends on identified social or environmental factors, and if variability within the groups that have on-average high and low vulnerability produces a problem of misclassification, then pressure would arise for researchers to differentiate among individuals within the groups. However, until distinguishing characteristics were found, parents, teachers, doctors, social workers, insurance companies, policy makers, friends, and individuals themselves could make no better use of genetic information than to treat individuals according to which genetic group they belonged to. Moreover, if additional research were not conducted or not successful, or if the cost of differentiating among individuals were too high, we might never get beyond treating individuals according to their genetic-group membership => Irony: An underacknowledged issue in pursuing personalized medicine lies in genetic information being used to treat people according to the mean of their genetic group (Taylor 2014).

# Heterogeneity #9a, Heterogeneity in pathways of development Case: Genomic medicine, PKU

"Imagine a world where families leave the hospital with their newborns and take their baby's complete genetic profile with them on a CD-ROM," Venter told his audience. "And imagine a world where your physician has as part of your medical record your genetic code, which can be used to determine, for example, your risk profile for side effects from drugs or other medical treatments. These might be possible in a genomics-based medical system in the near future." (Massoglia 2003)

"Imagine a world..." If the case of phenylketonuria (PKU) is any guide to our imagination, significant complexities should be expected to arise if neonatal genetic diagnosis and advice about risks and possible protective measures become widespread. Until the 1960s people with two PKU genes always suffered severe mental retardation. But now the brain damage can be averted by a special diet free of the amino acid phenylalanine following detection of those newborns having high phenylalanine levels. Yet the certainty of severe retardation has been replaced by a chronic disease with a new set of problems (Paul 1988). Screening of newborns became routine quite rapidly during the 1960s and 70s, but there remains an ongoing struggle in the USA to secure health insurance coverage for the special diet and to enlist family and peers to support PKU individuals staying on that diet through adolescence and into adulthood. For women who do not maintain the diet well and become pregnant, high phenylalanine levels adversely affect the development of their non-PKU fetuses; such "maternal PKU" is a public health concern that had not previously existed.

In contrast with the picture of environment overcoming genetic determination, PKU individuals are

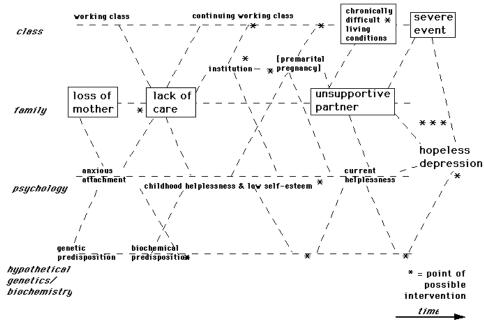
subject to heterogeneous influences on their pathways of development over the life course. A person with PKU who complies with the special diet may have experienced one or more of the following during their upbringing: health insurance coverage of the diet, a family that went without other amenities so as to afford it without insurance, or parents affluent enough to afford it anyway; a family that bent their cultural or religious dietary norms to accommodate the diet or a family without such norms; parental support for resisting peer pressure to eat other foods and/or a school community that instilled sensitivity to special needs; a sense of responsibility as a female in relation to the adverse effects of high levels of phenylalanine if they become pregnant on the development of their fetuses; summer camps where they meet other teenagers with PKU; and so on.

The multi-stranded life-course development of a person with PKU involves questions about control and social infrastructure and opens up possibilities for participation. Who is responsible if a baby is diagnosed with PKU, protective measures are not taken or are not sustained, and the child becomes a retarded adult or mother of a child with maternal PKU? Anyone wanting to improve the lives of PKU individuals needs to consider where they are prepared to get involved—Would the best point of engagement be around reduction in false positives or negatives? Diagnosis of variability in effects of exposure? Personal motivation and understanding of people with some mental deficits? Support groups for individuals and families? Insurance coverage for the special diet and for counseling? Paid family leave, or...? The possibilities for participation are diverse, depending on how people who want to help... can build or adjust the relevant social infrastructure.

Complicating the common claims that molecular biology and biotechnology will allow genetic information to reshape human life, in practice many diverse materials, tools, and other people have to be engaged to realize any enduring result (Taylor 2009).

# Heterogeneity #9a, Intersecting processes & #10, Participatory restructuring of the dynamics that generated the data

Case: Social origins of depression



Pathways to severe depression in a study of working class women (discussed in Taylor 2009, building on Brown and Harris 1989). The dashed lines indicate that each strand tends to build on what has happened earlier in the different strands.

\* indicate possible points of intervention that different kinds of agents could pursue to modify the intersecting processes. No intervention is guaranteed to prevent the clinical depressions; the interventions need to be jointly pursued.

# Heterogeneity #11, Participatory restructuring in tension with deployment/withholding of trans-local knowledge & resources

### Case: Participatory community planning

This takes seriously the creativity & capacity-building from well-facilitated participation among the different people who share a place or livelihood (Stanfield 2002; e.g., LH figure). The challenge is to mitigate adverse translocal decisions (e.g., RH figure), doing so perhaps by incorporating knowledge-making of non-local or trans-local researchers—including their analyses of abstracted dynamics of political-economic change (Taylor 2009).

Vision 20/20 WEST NIPISSING VISION February 1993									
STRONG DIVERSIFIED ECONOMIC BASE			EXCITING ATTRACTIVE COMMUNITY TO LIVE IN			ACTIVELY INVOLVED POPULATION			
									WIDELY PROMOTED TOURISM BASE
Broad Based Tourism Promotion	Modern Recycling Facilities	Forestry Development	Improved Transportation Network Locally/Area	First Response Teams	Effective Cooperation Between Municipalities	Active Involvement of Citizens in All Community	Youth Activities Promoted and Supported	Accessible Expanded Adult Education	
Improved	Northern Ontario Service Industry Centre		Locally? Hea	Community Based Services for Mental Health &		Developments West Nipissing			
Four Season Accommodation	Appropriate Natural & Resource Based	Expanded Local Agricultural Market		Physically Challenged	Ongoing Citizen Involvement in Local Government	Team Cooperation	Improved Access to Lake Nipissing		
Accessible Waterways and	Industry Incentive		Well Serviced Community	Expanded Local Access to Specialized Clinics	Local Government	West Nipissing Friendly Welcoming Community		Focused Job Training Programs	
Waterfronts	Programs to Attract Businesses	Fish Hatcheries		Coordinated Integrated	Local Service Boards in	Rural Residential	Broadened Leisure		
Packaged Tourist Attractions &	Francophone Bilinguial College		Environmentally	One Roof  Expanded	Unincorporated Municipalities	Open Communication	Activities and Facilities	Enhanced	
Tours	Local Businesses meet		Responsive Community	Vibrant Senior Citizen Community	Re-evaluate	across West Nipissing	Improved	Post Secondary Education	
Expanded Coordinated Community	all needs  Attract	Clean Lake Nipissing		Restructured Social Assistance	By-laws	Youth Involved in Planning All Activities	Organized Sports		
Festivals	Attract Government Offices			System System		Activities			

Gripped by uncertainty: Sturgeon Falls springs into action follo...

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Gripped by uncertainty: Sturgeon Falls springs into action following the closure of its primary employer.

Print

Author: Haddow, Scott Hunter

Date: Jan 1, 2003 Words: 942

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Sturgeon Falls is again facing the job loss blitzkrieg that is sweeping across Northern Ontario. Weyerhaeuser closed their containerboard mill in Sturgeon Falls on Dec. 5. The closure affected 140 workers and an entire community.

"It translates into a major financial loss to the municipality," says Gary O'Connor, mayor of Sturgeon Falls.

### **REFERENCES**

- Borges, J. L. (1964). Other inquisitions, 1937-1952. Austin: University of Texas Press.
- Brown, G. W. and T. O. Harris, Eds. (1989). Life Events and Illness. New York: Guilford Press.
- Caspi, A., McClay, J., Moffitt, T. E., et al. (2002). Role of Genotype in the Cycle of Violence in Maltreated Children. Science, 297: 851-854.
- Colquhoun, J. (1998). "Why I Changed My Mind About Water Fluoridation." Fluoride 31(2): 103-118.
- Eikelboom, J. W. and G. J. Hankey (2003). "Aspirin resistance: a new independent predictor of vascular events?" <u>Journal of the American College of Cardiology</u> 41: 966-968.
- Foucault, M. (1971). The order of things: an archaeology of the human sciences. New York, Pantheon.
- Hirschman, C., R. Alba, R. Farley (2000). "The Meaning and Measurement of Race in the U.S. Census: Glimpses into the Future." <u>Demography</u> 37(3): 381-393.
- Kaplan, J. (2000) The Limits and Lies of Human Genetic Research. New York: Routledge
- Massoglia, M. P. (2003). "Genomics and 'The Promise of Tomorrow'." <u>Visions (Wake Forest University School of Medicine)</u> Winter/Spring.
- McLaughlin, P. (1989). "Obstacles to a new sociology of agriculture: The persistence of essentialism."

  Working Paper, Department of Rural Sociology, Cornell University.
- Nuffield Council on Bioethics (2002). "Genetics and Human Behavior: The Ethical Context." <a href="http://www.nuffieldbioethics.org">http://www.nuffieldbioethics.org</a> viewed 22 June 2007.
- Paul, D. (1998). The history of newborn phenylketonuria screening in the U.S. <u>Promoting Safe and Effective Genetic Testing in the United States</u>. N. A. Holtzman and M. S. Watson. Baltimore: Johns Hopkins University Press: 137-160.

- Rose, G. (2008 [1992]). Rose's Strategy of Preventive Medicine. Oxford: Oxford University Press.
- Stanfield, R. B. (2002). <u>The Workshop Book: From Individual Creativity to Group Action</u>. Toronto: Canadian Institute of Cultural Affairs.
- Taylor, P. J. (2005). <u>Unruly Complexity: Ecology, Interpretation, Engagement</u>. Chicago: University of Chicago Press.
- Taylor, P. J. (2009). "Infrastructure and Scaffolding: Interpretation and Change of Research Involving Human Genetic Information." <u>Science as Culture</u> 18(4): 435-459.
- Taylor, P. J. (2010). "Three puzzles and eight gaps: What heritability studies and critical commentaries have not paid enough attention to." <u>Biology & Philosophy</u> 25(1): 1-31.
- Taylor, P. J. (2014). "Heterogeneity, not randomness, sets challenges for quantitative genetics and epidemiology: A response to Davey Smith's 'gloomy prospect'," under review.
- Tilley, N. 2000. "Realistic Evaluation: An Overview" (Presented at the Founding Conference of the Danish Evaluation Society, September 2000), <a href="http://www.evidence-basedmanagement.com/research\_practice/articles/nick\_tilley.pdf">http://www.evidence-basedmanagement.com/research\_practice/articles/nick\_tilley.pdf</a>, viewed 29 August 2011.
- Weldon, K. L. (2000), "A Simplified Introduction to Correlation and Regression," <u>Journal of Statistics</u>

  <u>Education</u>, 8, http://www.amstat.org/publications/jse/secure/v8n3/weldon.cfm, viewed 22 Jun '09.
- Wright, S. (1920) cited in Provine, W. (1986). <u>Sewall Wright and Evolutionary Biology</u>, Chicago: University of Chicago Press, p. 154.