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LATIN HYPERCUBE SAMPLING WITH THE SESOIL MODEL

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Latin Hypercube Sampling With The SESOIL Model

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I. ABSTRACT

The seasonal soil compartment model $SESOL₁^{1,2}$ a one-dimensional vertical transport code for chemicals in the unsaturated soil zone, has been coupled with the Monte Carlo computer code PRISM,³ which utilizes a Latin hypercube sampling method. Frequency distributions are assigned to each of 64 soil, chemical, and climate input variables for the SESOIL model, and these distribution*s* are randomly sampled to generate N (200, for example) input data set*s*. The SESOIL model is run by PRISM for each set of input values, and the combined set of model variables and predictions are evaluated statistically by PRISM to summarize the relative influence of input variables on model results. Output frequency distributions for selected SESOIL components are produced.

*A*s an initial analysis and to illustrate the PRISM*/*SESOIL approach, input data were compiled for the model for three sites at different regions of the country (Oak Ridge, Tenn.; Fre*s*no, Calif.; Fargo, N.D.). The chemical chosen for the analysiswas trichloroethylene (TCE), which wa*s* initially loaded in the soil column at a 60- to 90-cm depth. The soil type at each site was assumed to be identical to the cherty silt loam at Oak Ridge; the only difference in the three data sets was the climatic data. Output distributions for TCE mass flux volatilized, TCE ma*s*sflux to groundwater, and residual TCE concentration in the lowest *s*oil layer are vastly different for the three sites.

II. INTRODUCTION

Computer simulation models for the fate and transport of chemicals in soils are being used for guidance in identifying residual chemical concentrations in the soil column which will have little or no affect on groundwater quality. Different regions of the United States can be expected to have different levels of acceptable soil contamination because of the wide range of soil*s*, vegetation, and climatic conditions. An initial simulation investigation has been completed that demonstrates the different soil cleanup criteria required for different regions of the United States.

The screening-level code SESOIL, a one-dimensional vertical transport and fate model for chemicals in the unsaturated soil zone, was selected for this work based on SESOIL's wide use in waste-site assessments. SESOIL was developed at Arthur D. Little, Inc., by Bonazountas and Wagner,¹ and enhanced and modified at Oak Ridge National Laboratory (ORNL) by Hetrick et al.² under Environmental Protection Agency (EPA) *s*pon*s*orship. Following SESOIL's release by EPA, the model has been developed as a component of the RISKPROtm software by General Sciences Corporation⁴ for assessment applications. SESOIL has been applied to soil cleanup levels in California^{5,6} and to site sensitivity ranking for Wisconsin soils for the Wisconsin Department of Natural Resources.⁷

An important aspect for determining soil cleanup criteria is the uncertainty that arises due to the variability of soil, vegetation, chemical, and climate factors that control chemical fate and transport. Monte Carlo simulation methods have been used to relate the uncertainties in transport model predictions and variability of model inputs. For this study, the Latin hypercube sampling method was us**ed** as a means of pr**o**pagat**i**ng frequency distributions through the SESOIL code to obtain frequency distributions of output variables, such as chemical flux to groundwater, volatilization flux, and residual chemical concentration in soil. The purpose of this paper is to illustrate the PRISM*/*SESOIL approach and to present a preliminary analysis for three sites from different regions of the country.

III**.** METH**O**D

The Monte Carlo computer code called PRISM,³ which uses Latin hypercube sampling, was linked with the seasonal soil compartment model SESOIL,^{1,2} a one-dimensional vertical transport code for the unsaturated soil zone. In PRISM (see Fig. 1), frequency distributions for 64 soil, chemical, and climate variables for SESOIL (see Table 1) are divided into N equal-probability classes (200, for example). Note that three precipitation variables, each having monthly values, comprise 36 of the 64 inputs. These distributions are randomly sampled to generate N input data sets. PRISM reads each set of input values, runs the SESOIL model, and outputs the model predictions. PRISM statistically evaluates the joint set of model variables and predictions, and indicates the most sensitive input variables for given output variables. Frequency distributions can be produced for up to eleven output variables that were selected for examination (see Table 2).

Initially, a sensitivity analysiswas done to aid in selection of variables that had the most influence on model predictions. For a sensitivity analysis, the coefficient of variation (100 * standard deviation */* mean) on each of the 64 parameters is set at 1% (i.e., a normal distribution with the standard deviation set at 1% of the mean). Based on this analysis, 9 of the 64 input variables were selected, and frequency distributions were assigned. Normal distributions were arbitrarily selected for state variables (bulk density, RS; disconnectedness index, C; porosity, N; and organic carbon content, OC) and log-normal distributions assigned for flux variables (air diffusion coefficient, D*A* and intrinsic permeabilities, Kll, K12, K13, and K14 for four soil layers). All other variables that could be assigned frequency distributions in PRISM*/*SESOIL were held constant at their mean values for this analysis.

Thus, fo**r** th**i**s stu**dy**, the n**i**ne **i**nput **di**stributions were **d**iv**i**de**d** into 200 equal p**r**obab**i**l**i**ty c**l**asses and sampled randomly, without replacement, to generate 200 input data sets (PRISM1 in Fig. 1). These 200 data sets contain random combinations of the variability represented in the input distributions. SESOIL was run 200 times using each of the assembled data sets (PRISM2 in Fig. 1). Finally, the statistical analysis (PRISM3 **i**n Fig. 1) ranks the influence of input variables for each model prediction. The Statistical *A*nalysis System (SAS)*8*was used to calculate the mean, standard deviation, and minimum and maximum values for each output distribution, and to produce the output frequency distributions.

IV. EX*A*MPLE ANALYSIS

For an initial analysis, input data were compiled for three different sites at different regions of the United States (Oak Ridge, Tenn.; Fresno, Calif.; Fargo, N.D.). The chemical chosen for the analysis was TCE since it is one of the most common pollutants found at Superfund sites and is classified as a probable human carcinogen by EPA. It was assumed that the soil type at each site was identical to the cherty silt loam selected for the Oak Ridge site application. Thus, the only differences in the three input data sets were the climatic data. Long-term monthly average climate data for SESOIL for e**a**ch **si**te were obt**a**i**n**e**d** from the clim**a**te **da**tabase in the RISKPRO" system, an information management tool designed to help users perform exposure assessments. **4**

The soil column was discretized into four soil horizons (60, 90, 150, and 200 cm thicknesses), each having 3 sublayers for a total of 12 sublayers. PRISM*/*SESOIL was run for each site for 10 years; each run used 200 simulations. In each case an initial loading of 300 **p**g of TCE wa*s* input to the first sublayer of the second soil horizon (60-90-cm depth). The 200 simulations for each site took approximately 8.8 hours to run on an IBM RISC System*/*6000 workstation.

V. RES**U**LTS

The simulation re*s*ult*s* presented here are intended to illustrate the approach and should not be taken as predictions. S*A*S was used to statistically evaluate results for each site for TCE mass volatilized, TCE mas*s*transported to groundwater, and TCE concentration in the lowest soilsublayer (VOI,AT*#*, GRNWTR#, and PCONC4L#, respectively from Table 2) for each of 10 years (# from 1 to 10). Tables 3-5 show results for the mean, standard deviation, minimum, and maximum for each parameter for the Oak Ridge, Tenn.; Fresno, Calif.; and Fargo, N.D. sites, respectively. Note that most of the chemical migrated to the groundwater during years 2 to 6 at the Oak Ridge site, but at the Fresno site most of the TCE volatilized to the atmosphere during the first 5 years. At Fargo, volatilization was the greater flux during the first 4 years, with greater groundwater flux after year 4. The chemical concentration in the lowest soil layer at the end of the 10-year simulation was highest at the Fargo site.

The relative frequency **di**str**i**butions (frequency*/*number of iterations) for VOLAT, GRNWTR, an**d** PCONC4L for selected years at each site show a range of skewed distributions (see Figs. 2-10). The TCE mass to groundwater for Oak Ridge and Fargo showed a normal distribution in year 2 and year 7, respectively (Figs. 2 and 8), whereas the equivalent distribution for Fresno in year 8 was strongly skewed to the left (Fig. 5). Fresno showed a normal distribution for volatilization flux in year 1 (Fig. 6), while for Oak Ridge and Fargo the distributions for volatilization flux were skewed to the left (Figs. 3 and 9, respectively). The soil concentration distribution was normal for Oak Ridge in year 2 (see Fig. 4), was skewed to the left at Fresno in year 7 (Fig. 7), and was skewed to the right in year 6 at the Fargo site (Fig. 10). While results shown here should be considered preliminary, it is apparent that the three sites have differing rates of TCE transport by volatilization and drainage to groundwater. These results infer that different cleanup guidelines may be appropriate for contrasting sites based on climatic differences.

VI. SUMM*A*RY*/*DISCUSSION

The search for suitable cleanup criteria for soils can be expected to show that differing levels of soil contamination may be considered benign in different regions of the United States because of differing sensitivities of hydrologic and vapor transport to the wide range of soil, vegetation, and climatic conditions. Computer simulation modeling is being used as a guide to identifying residual concentrations of chemical wastes in soil which have little or no significant effect on groundwater quality. To aid in involving uncertainty analysis with the computer modeling effort, the Monte Carlo computer code, PRISM, which uses Latin hypercube sampling, was linked with the seasonal soil compartment model SESOIL.

The appeal of using SESOIL for this approach is that SESOIL uses less soil, chemical, and meteorological values as input than similar models, while still considering the most important transport and transformation processes. Also, databases are available in RISKPRO $^{tm 4}$ to facilitate</sup> the gathering of data for the model.

The PRISM/SESOIL approach was illustrated by investigating the fate and transport of TCE at three site*s* in dif**f**erent areas of the United States (Oak Ridge, Tenn.; Fresno, Calif.; and Fargo, N.D.). Simulations have been used to evaluate the uncertainties associated with several input variables for the three sites. The TCE transport and fate varied across the three sites considered, based on regional climatic differences. The implications of region-to-region differences compared with site-to-site differences within a given region are under study, and further PRISM*/*SESOIL simulations are planned.

VII. ACKNOWLEDGMENTS

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X. FIGURE CAPTIONS

- Fig**. 1**. Fl**ow**c**ha**rt o**f** step**s** for t**he** PR**I**SM*/*S**E**SOIL **mod**el**.**
- Fig. 2. Relative frequency distribution for mass flux to groundwater during year 2 at the Oak Ridge, Tenn., site.
- Fig. 3. Relative frequency distribution for mass flux volatilized during year 1 at the Oak Ridge, Tenn., site.
- Fig. 4. Relative frequency distribution for average dissolved pollutant concentration in the lowe*s*t sublayer for year 2 at the Oak Ridge, Tenn., *s*ite.
- Fig. 5. Relative frequency distribution for mass flux to groundwater during year 8 at the Fresno, Calif., site.
- Fig. 6. Relative frequency distribution for mass flux volatilized during year 1 at the Fre*s*no, Calif., site.
- Fig. 7. Relative frequency distribution for average dissolved pollutant concentration in the lowest sublayer for year 7 at the Fresno, Calif., site.
- Fig. 8. Relative frequency distribution for mass flux to groundwater during year 7 at the Fargo, N.D., site.
- Fig. 9. Relative frequency distribution for mass flux volatilized during year 1 at the Fargo, N.D., site.
- Fig. 10. Relative frequency distribution for average dissolved pollutant concentration in the lowest sublayer for year 6 at the Fargo, N.D., site.

Fig. 1. Flowchart of steps for the PRISM/SESOIL model

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Fig 2. Relative frequency distribution for mass flux to groundwater during year 2 at the Oak Ridge, Tenn., site

Fig.4. Relative frequency distribution for average dissolved pollutant concentration in the lowest sublayer for year 2 at the Oak Ridge, Tenn., site

Fig. 7. Relative frequency distribution for average dissolved pollutant concentration in the lowest sublayer for year 7 at the Fresno, Cal**i**f., **s**ite

Fig. 8. Relative frequency distributi**o**n for mass flux t**o** groundwater during year 7 at the Fargo, N.D., site

Fig. 10. Reiative frequency distribution for average dissolved pollutant concentration in the lowest sublayer for year 6 at the Fargo, N.D., site

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