

MODULE 8

PERFORMANCE MODELS

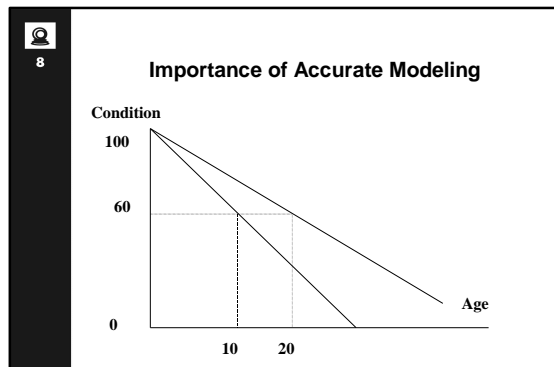
- ### Instructional Objectives
- Understand use of performance models
 - Identify common modeling approaches
 - Understand methods for evaluating reliability
 - Describe requirements for updating models

- ### Overview
- Serviceability-performance concepts
 - Deterioration as a representation of change in performance

- ### Uses of Performance Models in Pavement Management
- Network Level
 - Project Level

Types of Performance Models

	Deterministic				Probabilistic		
	Primary Response	Structural	Functional	Damage	Survivor Curves	Transition Process Models	
	• Deflection • Stress • Strain	• Distress • Pavement Condition	• PSI • Safety	• Load Equiv.		Markov	Semi-Markov
National Level				E	E	E	E
State or District Level		E	E	E	E	E	E
Project Level	E	E	E	E			





Performance Model Development Criteria

- Adequate database
- Inclusion of all significant variables that affect performance
- Adequate functional form of the model
- Satisfaction of the statistical criteria concerning the precision of the model
- Understanding of the principles behind each modeling approach



Data Requirements

- Requirements vary depending on the type of model being developed
- Inventory Information
- Monitoring Data

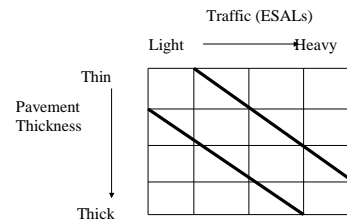


Lack of Historical Data

- If historical databases are not available due to changes in survey procedures, new rehabilitation techniques, or other factors, other techniques are available:
 - incorporate input from experienced practitioners
 - update the models as additional data are available



On-the-Diagonal Issue



Data Requirements

- Sufficient amounts of data must be used
- Data must be measured accurately and without bias
- Data must be representative
- Data must be maintained over time



Model Limitations

- Models must be used appropriately
- Limitations of models must be considered
- Boundary conditions should be identified and satisfied



Deterministic vs. Probabilistic

- Predicted Occurrence
- Techniques



Mechanistic Models

- No purely mechanistic performance models have been developed
- Calculated stress and strain attributes from mechanistic models can be used as the input for an empirical prediction model



Mechanistic-Empirical Models

- Models developed using pavement response as the dependent variable
- Use elements of both mechanistic models (fundamental principles of pavement behavior) and empirical models (results from experience or experiments)
- $N = A * (1/e)^B$



Regression Analysis

- A technique used to determine the relationship between variables
- Often used in agencies with historical databases available



Subjective Approaches

- Used in agencies that do not have historical data available
- Can be used to develop either deterministic or probabilistic models



Development of Deterministic Performance Models

- Very common modeling techniques in pavement management
- Predict a single number based on its relationship with one or more variables
- Can be empirical or mechanistic-empirical correlations calibrated using regression
- Condition is modeled as a function of other variables

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Regression Analysis

- Statistical tool used to establish the relationship between two or more variables
- Models can be linear or non-linear, depending on the relationship between variables

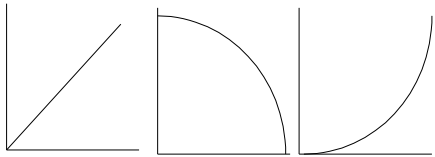
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Regression Model Forms

- **Linear Regression**
 - $Y = a + bX$
- **Multiple Linear Regression**
 - $Y = a_0 + a_1X_1 + a_2X_2 + \dots + A_nX_n$
- **Non-Linear Regression**
 - $Y = a_0 + a_1X^1 + a_2X^2 + \dots + A_nX^n$
 - Polynomial regression models may be constrained
 - Least squares fit is used to improve the models

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Deterministic Model Forms



Linear Polynomial Hyperbolic

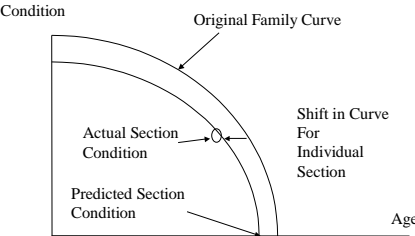
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Family Models

- Reduces number of variables
- Group pavement sections by characteristics
- Assume similar deterioration patterns
- Reflects average deterioration for family
- Allows ranges of values to be used for developing families

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Shift of the Family Performance Model



Condition

Original Family Curve

Actual Section Condition

Predicted Section Condition

Shift in Curve For Individual Section

Age

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Advantages/Disadvantages to Family Models

- Advantages
- Disadvantages



Statistical Evaluation of Models

- Coefficient of determination (R^2)
- Root mean square error (RMSE)
- Number of data points (n)
- Hypothesis tests on regression coefficients



Coefficient of Determination (R^2)

- Provides an indication of how much of the total variation in the data is explained by the regression equation or performance curve
- Network Level normally < 0.9
- Project Level normally > 0.9



RMSE

- Standard deviation of the predicted dependent variable value for a specific value of the independent variable
- Project Level: ≤ 5
- Network Level: > 5



Other Tests

- Number of Data Points
- Hypothesis Test of Regression Constants



Limitation of Statistical Evaluations

- Statistical analyses only evaluate reliability of model for data used in its development
- A model can be statistically valid but not representative of actual deterioration patterns of network if poor quality data are used



Reliability of Performance Models

- Network Level
- Project Level

Reliability of Performance Models

Regression Parameter Expectations				
PMS Analysis Level	R ²	RMSE	Sample Size	# of Independent Variables
Network	Medium to Low	Medium to Low	Large Sample	>1
Project	High	Low	Small Sample	1

Update Requirements

- Performance models must be updated regularly to continue to reflect deterioration patterns
- Feedback loops should be established to link deterioration models with engineering practices.

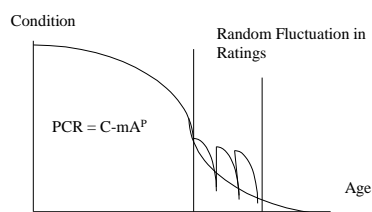
Examples

- **Washington DOT**
 - Deterministic models
- **Illinois DOT**
 - Deterministic models

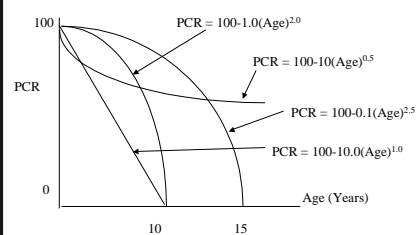
Washington State DOT

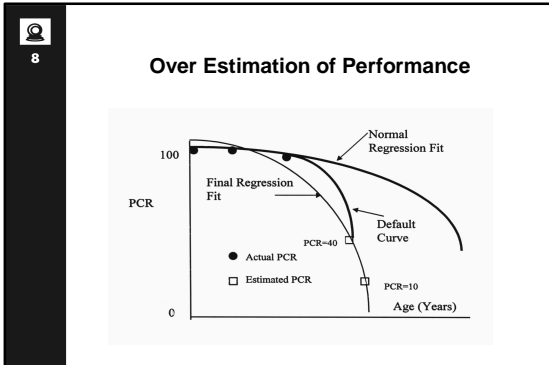
- Priority programming process
- Developed in-house
- Prediction models developed for combined ratings
- Raw distress severity and extent data are stored so models can be modified as needed
- Capabilities exist for statistical analysis of performance trends
- Performance models for individual sections

WSDOT Model Form



Fluctuations in Degree of Curvature in WSDOT Models



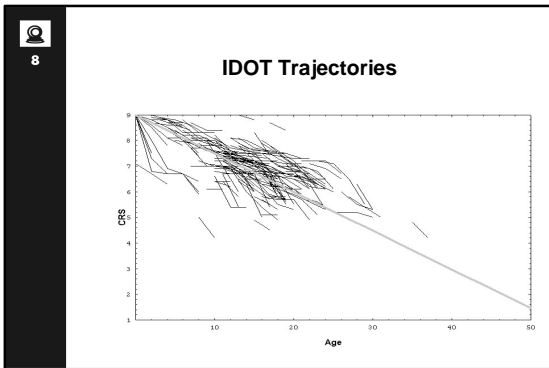
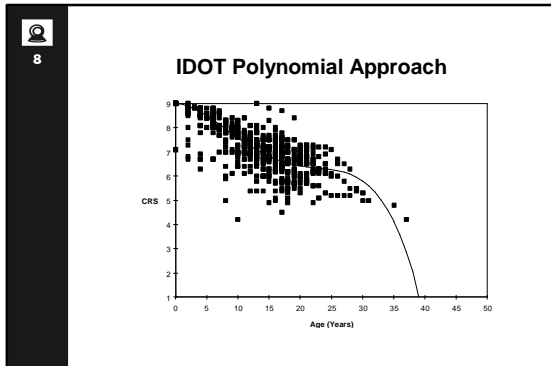


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- ### Illinois DOT Deterministic Models
- **Condition Rating Survey (CRS)**
 - 1.0 to 9.0
 - Type, severity, and extent of 5 predominant distress
 - **Automated the CRS Process**
 - Safety of expert panel
 - Reduction in staff
 - PaveTech vans purchased
 - Calculation of CRS value

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IDOT Family Models

System	Surface	District	Total
Interstate	Composite (2)	1-4	4
		5-9	
Non-Interstate	Concrete (2)	1-4	4
		5-9	
	Flexible (3)	1-4	3
		5-9	
Overlays (5)	Concrete (4)	(1-9)ST	9
		1-4	
		5-9	
SMART	Flexible & OL (4)	(1-9)CRC	8
		1-4	
		5-9	4



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- ### D-Crack Adjustments
- **Asphalt concrete overlays: deducts increased by 20%**
 - **Jointed reinforced concrete: deducts increased by 20%**
 - **CRCP: deducts increased by 50%**



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